# Anesthetics fragment hippocampal network activity, alter spine dynamics and affect memory consolidation

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### 21 ABSTRACT

22 General anesthesia is characterized by reversible loss of consciousness accompanied by 23 transient amnesia. Yet, long-term memory impairment is an undesirable side-effect. How 24 different types of general anesthetics (GAs) affect the hippocampus, a brain region central to 25 memory formation and consolidation, is poorly understood. Using extracellular recordings, 26 chronic 2-photon imaging and behavioral analysis, we monitor the effects of isoflurane (lso), 27 medetomidine/midazolam/fentanyl (MMF), and ketamine/xylazine (Keta/Xyl) on network 28 activity and structural spine dynamics in the hippocampal CA1 area of adult mice. GAs robustly 29 reduced spiking activity, decorrelated cellular ensembles, albeit with distinct activity signatures, 30 and altered spine dynamics. CA1 network activity under all three anesthetics was different to 31 natural sleep. Iso anesthesia most closely resembled unperturbed activity during wakefulness 32 and sleep, and network alterations recovered more readily than with Keta/XvI and MMF. 33 Correspondingly, memory consolidation was impaired after exposure to Keta/Xyl and MMF, 34 but not Iso. Thus, different anesthetics distinctly alter hippocampal network dynamics, synaptic 35 connectivity, and memory consolidation, with implications for GA strategy appraisal in animal 36 research and clinical settings.

37

### 38 KEYWORDS

- 39 General anesthesia, isoflurane, ketamine, fentanyl, sleep, hippocampus, population
- 40 dynamics, network activity, spine turnover, episodic memory

### 41 INTRODUCTION

42 General anesthesia is a drug-induced, reversible behavioral condition encompassing 43 unconsciousness, amnesia, sedation, immobility, and analgesia [1, 2]. Together, these aspects 44 represent a state where surgery can be tolerated without the requirement for further drugs [2]. 45 The behavioral effects of GAs are dose-dependent. At clinical (i.e. highest) dosage, they 46 should induce unconsciousness, even though experimental evidence of this phenomenon is 47 challenging to collect (in the absence of a verifiable consciousness theory). At lower doses, 48 some GAs cause unresponsiveness and loss of working memory, phenomena that have both 49 been hypothesized to potentially confound the apparent loss of consciousness [3, 4]. At much 50 lower doses still, GAs cause profound retrograde amnesia. When general anesthesia fails to induce such behavioral effects, intraoperative awareness ensues, a condition that is 51 52 associated with long-term adverse health consequences [5]. While loss of memory is required 53 during anesthesia administration, so that no memories of the surgical procedure are formed 54 [1, 6], long-term impairment of retrograde or anterograde memories is not desired. Although 55 general anesthesia is generally considered a safe procedure, growing literature points to the 56 possibility of long-term negative effects on the central nervous system [7]. This is particularly 57 true for specific categories of patients, such as the elderly, infants and children [7]. Among the 58 observed side effects, the most common are post-operative cognitive dysfunction syndromes, 59 including post-operative delirium and post-operative cognitive decline. Post-operative 60 cognitive disturbances are positively correlated with the duration of anesthesia and a single 61 exposure to GAs can cause retrograde and anterograde memory deficits that persist for days 62 to weeks in rodent models [8]. These aspects point to a generalized action of GAs on the 63 memory system.

64 Given that amnesia is a fundamental part of general anesthesia and that the hippocampus 65 controls memory formation and consolidation, it is important to understand how anesthetics 66 affect hippocampal function and how this compares to sleep – a naturally occurring state of 67 unconsciousness. Together with the subiculum, the CA1 area constitutes the main 68 hippocampal output region. CA1 pyramidal cells receive excitatory synaptic input mainly from 69 CA3 (in strata oriens & radiatum) and layer 3 of entorhinal cortex (in stratum lacunosum 70 moleculare), relaying information about the internal state of the animal and sensory inputs from 71 the external environment, respectively [9]. Inputs along these pathways are processed in an 72 integrative manner in CA1 [10]. Thus, CA1 pyramidal cells have been suggested to be a site 73 of sensory integration, with synaptic spines as a possible location of memory storage [11-14]. 74 Moreover, dynamic modulation of spine stability has been linked to synaptic plasticity [15-18]. 75 Synaptic plasticity, in turn, underlies learning and memory formation [19], suggesting that spine 76 turnover in the hippocampus directly reflects these processes [20, 21]. Considering the low 77 concentrations of anesthetics required to induce amnesia, these compounds are thought of 78 being particularly effective on the hippocampus. One possible explanation of this sensitivity is 79 the fact that a class of y-aminobutyric acid receptors (GABARs), which is strongly modulated 80 by some anesthetics, is predominantly expressed in the hippocampus [22, 23]. Other 81 anesthetics, such as ketamine, inhibit N-methyl-D-aspartate receptors (NMDARs) in a use-82 dependent manner and therefore may be particularly effective in inhibiting synaptic plasticity. 83 required for the formation of episodic-like memories [24]. However, a systematic investigation 84 of the effects of anesthetics on the hippocampus, bridging synaptic, network and behavioral 85 levels, is still lacking.

Here, using extracellular LFP and spiking recordings and chronic 2-photon calcium and spine
 imaging in vivo in combination with behavioral analysis, we systematically assessed how CA1

network dynamics, synaptic structure and memory performance are affected by three 88 89 commonly used combinations of GAs: isoflurane (Iso), midazolam/medetomidine/fentanyl (MMF), and ketamine in combination with xylazine (Keta/Xyl). We further measured CA1 90 91 network dynamics during wakefulness and natural sleep. Unlike sleep, all three GAs strongly reduced overall neuronal spiking compared to wakefulness. Moreover, opposite to what has 92 93 been found in the neocortex [25-27], they decorrelated network activity, leading to a 94 fragmented network state. However, the induced patterns of activity were highly distinct 95 between the three different anesthetic conditions and recovered to the pre-anesthetic status 96 with disparate rates. Testing the effect of repeated anesthesia on spine dynamics revealed 97 that Keta/Xyl, the condition which most strongly affected calcium activity, significantly reduced 98 spine turnover, leading to an overall (over)stabilization of hippocampal synapses. In contrast, Iso and MMF mildly increased spine turnover. Finally, we show that the two anesthetic 99 100 conditions which induce the strongest reduction and fragmentation of CA1 network activity, 101 Keta/Xyl and MMF, negatively influenced hippocampus-dependent memory consolidation. On 102 the other hand, Iso, which most closely resembled unperturbed sleep and wakefulness, did not 103 impair memory consolidation, even when maintained over time periods matching the longer 104 recovery phase of Keta/Xyl or MMF. Thus, different anesthetics, despite inducing a similar 105 physiological state, strongly differ in their effects on synaptic stability, hippocampal network 106 activity, and memory consolidation.

107

### 108 **RESULTS**

### 109 Iso, Keta/Xyl and MMF induce distinct patterns of network activity

110 Iso, Keta/Xyl and MMF have distinct molecular targets and modes of action in the brain. We 111 therefore hypothesized that electrical activity in the hippocampus might be uniquely altered by 112 the three anesthesia strategies. To test this hypothesis, we investigated local field potentials (LFPs) and firing of individual neurons (single-unit activity, SUA) extracellularly recorded in the 113 114 CA1 area of the dorsal hippocampus (dCA1) during wakefulness, followed by 45 min of 115 anesthesia and 45 min of recovery (Fig. 1A, S1A). We found that the anesthetics differently 116 affected population activity, inducing characteristic modulation of various frequency bands 117 (Fig. 1B). During wakefulness, LFP power in CA1 was highest in the theta (4-12 Hz) and low-118 gamma (40-60 Hz) frequency bands (Fig. S1B). Exposure to 2-2.5% Iso led to a strong 119 reduction of LFP power > 4 Hz within the first 2 minutes, which was accompanied by complete 120 loss of mobility of the animal (Fig. 1C, S1B,C). Similarly, MMF injection promptly decreased 121 LFP power in the same frequency bands. In contrast, Keta/Xyl increased power across all 122 frequencies during the first 10 min after injection, the most prominent effect being observed for 123 activity at 5-30 Hz. This is consistent with previous reports, finding enhanced theta and low-124 gamma power in CA1 of rats under ketamine anesthesia [28]. The initial LFP power increase 125 was followed by a gradual, significant decrease of 30-100 Hz activity (Fig. 1C, S1B,C).

126 It is widely accepted that, in the neocortex, GAs favor slow oscillations at the expense of faster 127 ones [29]. To determine whether this is also the case in the hippocampus, we next asked how 128 the investigated anesthetics affect slow network oscillations. Consistent with previous reports 129 [30-32], Keta/Xyl strongly enhanced LFP power at 0.5-4 Hz throughout the entire recording 130 period (Fig. 1C,D, S1C), but suppressed frequencies lower than 0.5 Hz. In contrast, Iso 131 strongly augmented LFP power below 0.5 Hz, peaking at 0.1-0.2 Hz (Fig. 1C,D, S1C), whereas 132 MMF induced no significant increase in the low-frequency regime. However, similar to 133 Keta/Xyl, a significant reduction was present below 0.5 Hz, which persisted throughout the

134 entire recording period (Fig. 1C,D). Analysis of the power-law decay exponent (1/f slope) of 135 the LFP power spectrum facilitates detection of non-canonical changes in LFP power, including aperiodic (non-oscillatory) components [33]. The 1/f slope has been hypothesized to track 136 137 excitation/inhibition (E/I) balance [34, 35], and is reduced in the cortex under anesthesia [36, 138 37], indicating a shift towards inhibition. Considering the robust effects on LFP power that we 139 reported, we reasoned that the 1/f slope might also be altered. Indeed, all anesthetics 140 significantly decreased the 1/f slope, albeit with a different temporal profile. While the effect of Iso occurred within a few minutes, MMF and Keta/Xyl operated on a longer timescale (Fig. 1E). 141 142 Moreover, periods of activity were consistently and strongly reduced immediately under Iso 143 and MMF, but delayed by 30 min under Keta/Xyl (Fig. 1F). These results indicate that all 144 anesthetics shift the LFP to lower frequencies and tilt the E/I balance towards inhibition, albeit 145 with different temporal profiles.

146 In contrast to Keta/Xyl-anesthesia, Iso- and MMF-anesthesia can be efficiently antagonized. 147 Removing the face mask is sufficient to antagonize Iso-anesthesia, while antagonization of 148 MMF-anesthesia requires injection of a wake-up cocktail (Flumazenil, Atipamezole and 149 Buprenorphine, FAB) [38, 39]. 20-30 min after Iso withdrawal, animals regained motility and 150 periods of silence in the LFP receded (Fig. 1C,F). However, in contrast to post-Iso, LFP power 151 did not fully recover after FAB, remaining significantly reduced at frequencies below 0.5 and 152 above 30 Hz for the entire 45 min-post anesthesia recording period (Fig. 1C,D). In contrast, 153 elevated LFP power in the 0.5-4 Hz band and reduction in active periods remained significant 154 throughout the entire recording in the presence of Keta/Xyl. In line with these results, the 1/f 155 slope promptly reverted to values similar to baseline after Iso discontinuation. In contrast, the 156 recovery was only transitory and partial after MMF antagonization, and virtually absent for 157 Keta/Xyl (Fig. 1E), indicating that the E/I balance recovered only after Iso within 45 min.

158 Cross-frequency coupling between theta and gamma oscillations has been suggested to 159 underlie information transfer in the hippocampus [40]. Given the strong decrease of theta 160 power in the presence of Iso and MMF, we reasoned the phase modulation of the gamma 161 rhythm could also be altered. To test this, we used phase-amplitude coupling (PAC) to 162 measure whether the phase of slow LFP oscillations modulates the amplitude of the signal at 163 a higher frequency. In line with previous results [41, 42] a significant coupling between theta 164 and gamma frequency bands, as well as between frequencies in the 1-2 Hz range and gamma 165 was present in the awake state (Fig. 1G). Moreover, anesthesia strongly altered PAC. In 166 accordance with the LFP power analysis, the coupling reached a maximum strength between 167 the dominant slow-frequency oscillations induced by the various anesthetics (<0.5 Hz for Iso, 168 ~1 Hz for MMF and 0.5-4 Hz for Keta/Xyl) and gamma (Fig. 1G). For all anesthetics, the range 169 of phase-modulated amplitudes was wide, suggesting that the modulating phase corresponds 170 to the identified slow-wave activity.

Taken together, these data show that all three GAs differently and persistently modulated the
network oscillations in dCA1, a full recovery of activity being detected within 45 min only for
Iso.

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175 Figure 1: LFP recordings in dorsal CA1 during wakefulness and anesthesia reveal distinct and 176 complex alterations by Iso, Keta/Xyl and MMF. (A) Experimental setup. Extracellular electrical 177 recordings in dorsal CA1 were performed in four head-fixed mice for 105 min, continuously. Each animal 178 was recorded under all anesthesia as indicated in the scheme. Order of anesthetics was pseud-179 randomized. (B) Characteristic local field potential (LFP) recordings during wakefulness and under three 180 different anesthetics. (C) Color-coded modulation index (MI) plots (upper and middle panels) for LFP 181 power and motion profiles (lower panels) for the three different anesthetic conditions. Upper panels 182 display LFP power for 0-100 Hz frequency range, lower panels for 0-4 Hz. (D) Line plot displaying LFP 183 power spectra for the two time periods indicated by horizontal black bars. For comparison, the 15-min

184 spectrum of the awake period before anesthesia induction is plotted in both graphs. Statistical 185 differences are indicated in Fig. S1C (E) Line plot displaying the power-law decay exponent (1/f) of the 186 LFP power spectrum for the 30-50 Hz range. Lines display mean  $\pm$  SEM. (F) Line plot displaying the 187 fraction of active periods compared to the pre-anesthetic wakeful state, in 15 min bins throughout the 188 entire recording duration. Lines display mean ± SEM. (G) Heat map displaying Phase-amplitude-189 coupling (PAC) for pre-anesthetic wakeful state (left) and for the indicated time periods during 190 anesthesia. Different bin sizes (0.5 Hz and 1 Hz, separated by vertical black line) are used to resolve 191 low- and high-frequency PAC. Vertical dashed lines in (C) and (E) indicate time points of anesthesia 192 induction (Iso, MMF, Keta/Xyl) and reversal (Iso & MMF only). Vertical dashed line in (F) indicates time 193 point of anesthesia reversal (Iso & MMF only). Asterisks in (E) and (F) indicate significance of time 194 periods indicated by black horizontal line compared to 15-min period before anesthesia. Anesthetic 195 conditions are color-coded. Asterisks in (G) indicate significant differences compared to the 196 corresponding frequency band during wakefulness. \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001, n = 4 mice. For 197 full report of statistics, see statistics table.

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### 199 Delayed recovery of neuronal spiking patterns after anesthesia

200 While the LFP provides information about general network states in the hippocampus, it is 201 influenced by long-range activity and highly active regions in the vicinity of CA1 [43]. To assess 202 the effects of GAs on CA1 neurons, we analyzed the spiking of individual units (56-72 units 203 per animal, n=4 mice) before, during and after each of the anesthetic conditions. All anesthetics 204 significantly and rapidly (<1 min) decreased spiking activity in CA1 neurons (Fig. 2A,B, S2), 205 with MMF leading to the most potent suppression, followed by Iso and Keta/Xyl. These 206 alterations were generally present in all layers of CA1 (Fig. S2C). Although the bulk spike rate 207 was strongly reduced, the number of active neurons (see Methods) was only mildly affected 208 (Fig. 2C), reaching a significant reduction only with MMF. This observation suggests that 209 anesthesia broadly reduces neuronal activity, and does not modulate only a discrete 210 subpopulation of neurons. Both firing rate and the number of active neurons recovered within 211 45 min after reversal for MMF and Iso (Fig. 2A-C, S2). As previously reported for NREM sleep 212 [44], we found a negative correlation between the anesthesia-induced reduction of firing rate 213 and the firing rate in wakefulness (Fig S2B).

214 To investigate whether the rhythmicity of single neuron firing was affected similarly to the LFP, 215 we analyzed the spectral properties of 1 ms-binned SUA firing (i.e., power of SUA spike trains, for details, see Methods). In the presence of Iso, SUA power was consistently increased in the 216 217 range between 0 and 0.5 Hz (Fig. 2A,D, S2), in line with the strong modulation of LFP at 0.1-218 0.2 Hz. Of note, this effect did not vanish after Iso removal, suggesting that Iso has a long-219 lasting impact on firing rhythmicity. In contrast, and in line with its effects on the LFP, MMF 220 generally reduced, albeit less strongly, SUA power, including the low frequencies. A significant 221 reduction of SUA power was still present 45 min after antagonization in the 0-0.5 Hz band. 222 Keta/Xyl, on the other hand, only showed a tendency towards reduced SUA power in the 223 frequency band below 0.5 Hz, but increased SUA power significantly in the range between 0.5 224 and 4 Hz, consistent with its effect on the LFP (Fig. 2D). This modulation was present 225 throughout the entire recording. At higher frequencies, Iso led to a peak in the theta frequency 226 range, similar to wakefulness (Fig. 2E), yet it reduced the SUA power in the beta/gamma range. 227 Keta/Xyl and MMF caused an overall reduction in SUA power at frequencies >5 Hz (Fig. 2E). 228 Thus, GAs differentially impair spiking rhythmicity. These changes appeared to follow similar 229 dynamics than those in the LFP.

To confirm the synchrony between spikes and low-frequency oscillations, we calculated their pairwise phase consistency (PPC) [45]. When compared to pre-anesthesia, PPC values for the 0.1-0.5 Hz frequency band were augmented by Iso. Keta/Xyl increased coupling of spikes to the LFP between 0.5 and 1 Hz, whereas MMF showed a weak, but significant increase of coupling at frequencies below 1 Hz (Fig. 2F).

Similar to the LFP, the SUA firing rate nearly fully recovered during the 45 min post-Iso (Fig. 2A,B, S2), with even a slight, but significant increase at the end of the recording period. In contrast, after FAB-induced MMF reversal, CA1 spiking activity remained slightly reduced, reflecting the lack of LFP recovery. For Keta/Xyl, SUA remained suppressed during the entire recording period (Fig. 2B). Strikingly, SUA power did not fully recover for any of the tested anesthetics (Fig. 2E).

Taken together, we show that all investigated GAs caused a persistent and robust reduction of CA1 firing. Moreover, spiking during anesthesia was phase-locked to the GA-induced slow network oscillations.



245 Figure 2: Single unit activity in dorsal CA1 is strongly reduced during anesthesia, and remains 246 significantly altered long after its termination. (A) Raster plots of z-scored single-unit activity (SUA) 247 for the three different anesthetic strategies in four mice. Units are sorted according to initial activity 248 during wakefulness. (B) Line plot of SUA firing rate before, during and after anesthesia induction. (C) 249 Line plot displaying the fraction of active units compared to the pre-anesthetic wakeful state, for all three 250 anesthetics in 15 min bins throughout the entire recording duration. (D) Relative change of population 251 firing rate power in the 0-0.5, 0.5-1 and 1-4 Hz frequency band. SUA PWR = power of SUA spike trains. 252 (E) Line plot displaying the normalized power spectra of population firing rate for the two time periods 253 indicated by horizontal black bars. For comparison, the 15-min spectrum for pre-anesthetic wakeful state

254 is plotted in both graphs. (F) Pairwise phase consistency (PPC) at low frequencies in the same frequency 255 bands as (D), for the indicated time points during anesthesia. White dots indicate median, vertical thick 256 and thin lines indicate 1<sup>st</sup>-3<sup>rd</sup> quartile and interquartile range, respectively. Colored lines in (B) - (D) 257 display mean  $\pm$  SEM. Vertical dashed lines in panels (A), (B) and (D) indicate time points of anesthesia 258 induction (Iso, MMF, Keta/XyI) and reversal (Iso & MMF only). The vertical dashed line in (C) indicates 259 the time point of anesthesia reversal (Iso & MMF only). Asterisks in (B) - (D) indicate significance of 260 periods indicated by black horizontal line compared to period before anesthesia. Anesthetic conditions 261 are color-coded. Asterisks in (F) indicate significant differences to wakefulness. \* p < 0.05, \*\* p < 0.01, 262 \*\*\* p < 0.001, n = 4 mice. For full report of statistics, see statistics table.

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### Iso, Keta/Xyl and MMF reduce number, amplitude, and duration of calcium transients

To monitor the population dynamics of CA1 neurons in the presence of different anesthetics, we imaged the same field of view (FOV) using the genetically encoded indicator GCaMP6f [46] and systematically compared the activity of identified neurons during quiet wakefulness and in the presence of different anesthetics (Fig. 3A).

269 First, we considered all active neurons in each condition and analyzed the average rate (i.e., 270 the number of transients), amplitude, and duration (i.e., the decay constant) of calcium 271 transients across all imaging sessions in 7 mice. In line with the results of SUA analysis (see 272 Fig. 2C), a large number of CA1 pyramidal neurons were active in the presence of all three GAs. Using extraction parameters that restricted the number of ROIs but maximized signal 273 274 quality (see Methods), we obtained a median of 311 (min-max of 16-817) active neurons per 275 FOV, for a total of 189 five-minutes recordings. All GAs significantly altered calcium dynamics 276 in CA1 neurons, reducing the activity (Fig. 3C,D), as previously shown for neuronal spiking 277 (Fig. 2B). Also, in line with the effect on SUA (Fig. S2B), the magnitude of the anesthesia-278 induced reduction of calcium transients was negatively correlated with the wakefulness 279 calcium transients rate (Fig. S6D). However, each condition could be characterized by a 280 specific signature in their calcium dynamics. Iso yielded only a mild decrease of rate and 281 amplitude, but a strong reduction of duration of calcium transients (Fig. 3D). Consistent with 282 effects on LFP and SUA, calcium transients showed a spectral peak between 0.1 and 0.2 Hz (Fig. S4). In contrast to Iso, MMF did not significantly affect the duration of transients but 283 284 reduced their rate and amplitude when compared to wakefulness. Keta/Xyl-anesthesia had the 285 strongest effect on calcium transients, leading to a reduction of all three parameters compared 286 to wakefulness (Fig. 3D). Unlike for electrophysiological recordings, no spectral peak was 287 present in calcium transients, most likely due to the strong suppression of calcium activity by 288 Keta/Xyl. Considering all parameters, the four groups tended to segregate into clusters, one 289 consisting mostly of recordings under Keta/Xyl, and another one consisting of awake and Iso 290 recordings. Most recordings under MMF clustered between these two groups (Fig. 3E). 291 Importantly, these findings were robust to changes in the signal extraction pipeline. Varying 292 the threshold for calcium transient detection across a wide range of values did not affect the 293 reported effects on rate and height of transients (Fig. S3B). Further, conducting the same 294 analysis on neuronal activity metrics that are independent of calcium transients detection (integral and standard deviation) or on dF/F calcium signals also yielded analogous results 295 296 (Fig. S3C-E).

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299 Figure 3: Repeated calcium imaging in dorsal CA1 reveals distinct activity profiles for Iso, MMF 300 and Keta/Xyl. (A) Experimental strategy for chronic calcium imaging of cellular activity in dorsal CA1. 301 For each condition, seven mice were imaged four times for five minutes, as indicated by black fields in 302 the scheme. The order of imaging conditions was pseudo-randomized. (B) Time-averaged, two-photon 303 images of the same FOV in CA1 aligned to the Iso condition. ROIs of automatically extracted, active 304 neurons are overlaid for each condition. (C) Raster plots of z-scored calcium transients in the same 305 animal under different conditions. Traces are sorted by similarity. (D) Violin plots quantifying the number 306 (left), amplitude (middle), and decay (right) of detected calcium transients. White dots indicate median, 307 vertical thick and thin lines indicate 1st-3rd quartile and interquartile range, respectively. (E) tSNE plot 308 summarizing the average calcium transients properties. Each data point represents one recording 309 session. Asterisks in (D) indicate significant differences to wakefulness. \*\*\* p < 0.001. Note, to facilitate 310 readability, only differences to wakefulness are indicated. For full report of statistics, see statistics table.

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## Iso, Keta/Xyl and MMF distinctly modulate cellular calcium dynamics in individual neurons

One possible explanation for these distinct modes of calcium activity could be that each 315 316 anesthetic condition recruits a unique set of neurons characterized by particular spiking 317 properties. We tested this possibility by analyzing calcium transients in neurons that were 318 active during all conditions (Fig. 4A, S5, S6). To obtain a sufficient number of active neurons, 319 we extracted calcium transients using a lower quality threshold, accepting more neurons per 320 recording (see Methods). In this manner, we obtained a median of 783 neurons per recording 321 (min-max of 156-1641). While this shifted the overall distribution of calcium parameters to lower 322 values, the relative ratios between the four conditions remained the same and the differences 323 between anesthesia groups were preserved (Fig. S3F-G). Also, when considering only 324 neurons that were active in all four conditions, rate as well as amplitude of calcium peaks were 325 generally reduced under anesthesia, being lowest in the Keta/Xyl condition (Fig. 4B,C). 326 Compared to the whole dataset, differences in decay constant were less pronounced. The 327 median decay constant strongly decreased for awake and MMF conditions, while it increased 328 for Iso and Keta/Xyl. These results indicate that both the between- as well as the within-329 condition variance strongly decreased when considering only neurons active under all 330 conditions.

331 The relatively low number of neurons active in all four conditions (335 neurons) limited the 332 statistical analysis. Therefore, we compared neurons that were active in any two combinations 333 of conditions (Fig. S6C). This analysis further corroborated the similarity of neurons active 334 during wakefulness and Iso anesthesia (Fig. 4C, S6C). Rate, amplitude, and duration of 335 calcium transients were most similar between wakefulness and Iso compared to the other GAs. 336 In contrast, neurons active during wakefulness and either Keta/Xyl or MMF showed decreased 337 rate, amplitude and duration under anesthesia, with Keta/Xyl causing the strongest phenotype 338 (Fig S6C). Overall, this indicates that anesthetics influence the firing properties of hippocampal 339 neurons. However, the magnitude and direction of these effects vary considerably. Iso 340 anesthesia has the mildest effect, and it most likely arises from distinct neuronal populations 341 being active in the two conditions (wakefulness vs. Iso anesthesia), as the firing properties of 342 cells that are active in both are barely affected (Fig. 4B,C). On the other hand, the strong 343 effects of MMF and Keta/Xyl on all calcium parameters in the same cells indicate that different 344 anesthetics directly alter the firing properties of individual neurons. Thus, alterations in firing 345 properties of neuronal populations (e.g., SUA, Fig. 2B-D) are not solely explainable by different 346 subpopulations of neurons being active between awake and anesthesia.

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350 Figure 4: Calcium activity profiles in neurons active during all conditions are similar between 351 wakefulness and Iso. (A) Two-photon time-averaged images of the same FOV in CA1, aligned to the 352 Iso condition (same images as in figs. 3). ROIs show neurons active in each condition, allowing direct 353 comparison of calcium transients in the same cells under different conditions. (B) Violin plots quantifying 354 the number (left), amplitude (middle), and decay (right) of detected calcium transients. White dots 355 indicate median, vertical thick and thin lines indicate 1<sup>st</sup>-3<sup>rd</sup> quartile and interguartile range, respectively. 356 (C) Heat maps displaying the relative change in the number (left), amplitude (middle), and decay (right) 357 of calcium transients between neurons active in pairs of conditions (see also Fig. S6C). (D) Schematic 358 representation of long-term calcium imaging experiments to assess recovery from anesthesia. Black 359 rectangles indicate imaging time points (up to 10 min duration each). Filled and open triangles indicate 360 the start and end of the anesthesia period. (E) Line diagrams showing the relative change (modulation

index) of the median number of calcium transients (left), their amplitude (middle), and decay constant (right) during anesthesia and recovery relative to the awake state before anesthesia induction. The black bar indicates the anesthesia period. Shaded, colored lines indicate 95% confidence interval. Note, Keta/Xyl anesthesia could not be terminated. The horizontal, colored lines indicate significant difference (p < 0.05) to awake time point (t = 0) for the respective condition. Asterisks in (B) and (C) indicate significant differences to wakefulness. \*\*\* p < 0.001. Note, to facilitate readability, only differences to wakefulness are indicated. For full report of statistics, see statistics table.

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## 369 Population activity recovers with different temporal dynamics after Iso, Keta/Xyl and 370 MMF

371 The LFP recordings showed that network activity remained altered for 1.5 h after Keta/Xyl injection, but also after antagonization of MMF, while most aspects returned to pre-anesthetic 372 conditions during 45 min after Iso removal. To assess network effects of the different 373 374 anesthetics on a longer time scale, we used repeated calcium imaging during 6 hours after 375 anesthesia onset and 5 hours after Iso termination and MMF antagonization (Fig. 4D). In line 376 with our previous results, the number of calcium transients was strongly reduced 30 min after 377 MMF or Keta/Xyl injection, while the reduction had a lower magnitude for Iso. Similarly, MMF 378 and Keta/Xyl most strongly reduced the amplitude and duration of calcium transients, while Iso 379 mildly increased amplitude without affecting the decay constant (Fig. 4E).

380 Confirming the action dynamics monitored by LFP recordings in vivo, recovery from Iso 381 anesthesia was fast and only the rate of transients mildly changed during the hours after 382 removing the mask. In contrast, after Keta/Xyl injection, amplitude and duration of transients were altered throughout the following 6 hours, while the reduction of the calcium transients 383 384 rate was not reverted until up to 4 hours later. Recovery to the pre-anesthetic state was even 385 slower after MMF/FAB. Despite antagonization of MMF anesthesia with FAB, calcium 386 transients remained disturbed for up to 6 hours. Thus, the different anesthetics not only induce 387 unique alterations of CA1 network dynamics, but also show different recovery profiles (Fig. 388 S6E).

### 389 Anesthesia decorrelates hippocampal activity

390 Calcium imaging studies in the visual cortex of ketamine anesthetized rats [27] and Iso 391 anesthetized mice [25] showed that anesthesia increases the overall pairwise correlations 392 between firing neurons and, consequently, induces more structured patterns of activity. While 393 neocortical L2/3 cells typically show a high degree of local interconnectivity [47], this is not the 394 case for CA1, where pyramidal cells receive their main excitatory input from CA3 and 395 entorhinal cortex and send their efferents to subiculum and extrahippocampal areas [9]. 396 Another difference between neocortex and hippocampal CA1 area is that the neocortex 397 receives strong direct input from primary thalamus, which is a major source for slow oscillations 398 during anesthesia-induced unconsciousness and sleep [1, 48, 49]. In comparison to neocortex, 399 hippocampus shows different patterns of activity, including sharp waves, which are generated 400 intrinsically in the hippocampus, likely originating in CA3 [50]. To investigate whether these 401 differences cause a different impact of anesthesia on the population activity in CA1 when 402 compared to the neocortex, we analyzed the dynamical structure of population activity using 403 both calcium imaging and SUA of extracellular recordings in vivo. First, we analyzed Fisher-404 corrected Pearson pairwise correlation between neuropil-corrected raw fluorescence traces. 405 We found that both correlation and anticorrelation were highest in animals during quiet 406 wakefulness (Fig 5A-B). In particular, the awake condition had a higher proportion of

407 correlation coefficients both in the 1<sup>st</sup> as well as in the 4<sup>th</sup> quartile of the entire distribution and, 408 accordingly, higher absolute correlation values (Fig. 5B, S7A). Similar to the firing properties 409 (SUA, fig. 2), Iso induced the milder changes, whereas Keta/Xyl caused the strongest 410 phenotype. This relationship was preserved in neurons active during all conditions (Fig. S7B), 411 indicating that anesthesia generally reduces correlated activity between neurons and that this 412 effect is not attributable to the activity of particular neuronal subpopulations. Moreover, these 413 effects were not influenced by the distance between the pair of neurons whose correlation was quantified (Fig. 5C). These findings highlight the major differences between the anesthesia-414 415 induced effects on neuronal coupling in hippocampal CA1 and neocortex. In accordance with 416 the anatomy of CA1, the correlation between pairs of neurons was only mildly affected by the 417 distance between them, with or without anesthesia. Not only were neurons less highly 418 correlated to each other under anesthesia, but their coupling to the whole population activity 419 [51] was reduced as well. The proportion of neurons with population coupling in the 4<sup>th</sup> quartile 420 of the entire distribution was highest for awake, and most strongly reduced under Keta/Xyl and 421 MMF, while Iso showed only mild effects (Fig. 5D).

422 To further relate the calcium imaging data to extracellular recordings of neuronal firing, we 423 carried out an analogous analysis on SUA. To avoid the confounding effect of firing rate, we 424 quantified the correlation between pairs of neurons using the spike-time tiling coefficient [52], 425 a measure that is largely insensitive to variations of the firing rate (see Methods). To be 426 consistent with the calcium data, we quantified correlations within 1 second, a timescale of the 427 same magnitude as the decay constant used to extract calcium signals (700 ms). This analysis 428 confirmed that all anesthetics decorrelated neuronal activity (Fig. 5E). This effect was still 429 present, albeit less pronounced, using an integration window of 10 ms, which is closer to the 430 duration of action potentials (Fig. S7C). Overall, the decorrelation was milder under Iso anesthesia and stronger under Keta/Xyl and MMF. Thus, all three GAs decorrelated calcium 431 432 transients and spiking activity in the CA1 area, with MMF and Keta/Xyl inducing the most 433 prominent effects.

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### 452 Anesthesia fragments temporal and spatial structure of hippocampal activity

453 The decorrelation of neuronal activity during anesthesia suggests that GAs might impact the 454 spatial and temporal organization of CA1 neuronal ensembles (see Fig. 5A). To test this 455 hypothesis, we analyzed the same number of active neurons for each condition, since a 456 different number of neurons in each condition potentially influences the number and size of 457 detected clusters [26]. First, we monitored the impact of GAs on the temporal structure of CA1 activity. We defined the number of clusters identified by principal component analysis (PCA) 458 459 as the number of components that were needed to explain 90% of the variance. Moreover, we 460 assessed the power-law slope of variance explained over the first 150 components (Fig. 6A). 461 Both methods led to a larger number of clusters and a flatter power-law slope for anesthesia 462 when compared to wakefulness (Fig. 6A). Further corroborating these findings, both tSNE 463 dimensionality reduction and affinity propagation (AP) clustering (see Methods) also revealed 464 a larger number of clusters for anesthesia compared to wakefulness (Fig. 6B,C). These 465 observations indicate that activity is less structured under anesthesia. In line with previous 466 results, Iso had the weakest effect, whereas Keta/Xyl consistently induced the most 467 pronounced phenotype. Analysis of the deconvolved calcium traces led to comparable results 468 (Fig S8A,B). These findings support the idea that GAs fragment the hippocampal network into 469 a more diverse repertoire of microstates.

470 Second, we tested whether anesthesia disrupted the spatial structure of hippocampal activity, 471 employing a modularity maximization approach [53, 54] designed to detect internally densely 472 connected communities (modules). To allow detection of modules at varying sizes, we carried 473 out our analysis while varying a resolution parameter (gamma) and thus focusing on different 474 spatial scales. Using this approach, we showed that GAs increase the number of detected 475 communities over a wide range of resolution parameter values (Fig 6D). Moreover, the 476 modularity of these communities was lower than in wakefulness (Fig 6E). These results 477 indicate that anesthesia results in a more fractured network with, on average, smaller and less 478 coherent communities. A multi-resolution approach [55] followed by the selection of partitions 479 based on hierarchical consensus clustering yielded similar results (Fig. S8C). Among GAs, Iso 480 induced the mildest phenotype, whereas Keta/Xyl had the most prominent effects. Thus, GAs 481 not only decorrelate hippocampal activity, but also consistently fragment both its temporal and 482 spatial structure.



484

485 Fig. 6. Calcium activity in CA1 is temporally and spatially fragmented during anesthesia. (A) Left: 486 violin plot quantifying the number of principal component analysis (PCA) clusters during wakefulness or anesthesia, as indicated. Middle: log-log line plot displaying the variance explained by the first 100 487 488 components for each condition. Right: violin plot quantifying the power-law slope of the variance 489 explained by the first 100 components for each condition. (B) Left: tSNE plots of network events 490 recorded in the same animal under the four indicated conditions. Right: Violin plot quantifying the 491 number of tSNE clusters obtained from calcium recordings during the four different treatments. (C) Violin 492 plot quantifying the number of clusters obtained by affinity propagation from calcium recordings during 493 the four different treatments. (D) and (E) Line plots quantifying the number of detected communities and 494 the modularity of the detected communities with the resolution parameter gamma ranging from 0 to 3. 495 Horizontal lines in violin plots indicate median and 1st-3rd quartile. Asterisks in (A) - (C) indicate significant 496 differences to wakefulness. \*\* p < 0.01, \*\*\* p < 0.001. Horizontal lines above plots in (D) - (E) indicate 497 significant difference to wakefulness. Anesthetic conditions are color-coded. Note, only differences to 498 wakefulness are indicated. For comparison between conditions, see statistics table.

499

### 500 Network alterations during sleep are less pronounced compared to anesthesia

Altered CA1 activity under anesthesia may affect synaptic function and memory processing. A naturally-occurring form of unconsciousness is sleep, which is required for network processes involved in memory consolidation [49, 56]. To decide whether the network perturbations described above resemble those naturally occurring during sleep, we first monitored CA1 activity by recording the LFP and spiking together with animal motion and the neck-muscle electro-myogram (EMG) in head fixed mice (Fig. S9A). We classified the signal into 30 s-long epochs of wake, rapid-eye-movement (REM) and non-REM (NREM) sleep. Further, a certain 508 fraction of epochs, which we labelled as "uncertain", could not be reliably classified into any of 509 the previous three categories, (see Methods for details). Given that the behavioral attribution 510 of these epochs is uncertain and difficult to interpret, we excluded them from further analysis. 511 The animals spent most of their sleeping time in the NREM phase, with only short periods of 512 intermittent REM sleep (Fig. 7A,I). The LFP showed enhanced theta power during REM 513 phases, while the power at low frequencies was broadly increased during NREM sleep (Fig. 514 7B,C). Compared to anesthesia (Fig. 1), these changes in the LFP both during REM and NREM phases were modest. Along the same line, 1/f slope during NREM and REM sleep 515 516 slightly decreased, indicating a small reduction of the E/I balance that had a significantly lower 517 magnitude than the perturbation induced by GAs (Fig. 1D). Furthermore, the SUA rate was 518 slightly reduced (Fig. 7E-F), in contrast to all anesthetics, that strongly suppressed firing (Fig. 2). As previously reported [44], and similarly to the effect of GAs, we detected a small but 519 520 significant negative correlation between the NREM-induced reduction of firing rate and the 521 wakefulness firing rate, whereas the effect failed to reach statistical significance for REM sleep 522 alone (Fig. 7G). Moreover, NREM sleep induced a small reduction of pairwise correlation 523 between pairs of neurons, as measured by the spike-time tiling coefficient with an integration 524 window of one second.

525 To additionally investigate the effect of sleep on hippocampal activity, we used the above-526 mentioned recordings to train a machine-learning algorithm to classify wakefulness, NREM 527 and REM sleep from eye videography images alone (Fig. S9) [57] (see Methods for details). 528 In line with previous results, we were able to reliably distinguish wakefulness and NREM sleep 529 (4-fold cross-validation accuracy >85%), whereas REM classification was less precise (4-fold 530 cross-validation accuracy ~30%). This classifier was then used to predict the physiological 531 state of mice from which we recorded calcium transients in CA1 neurons. In the calcium imaging dataset, sleep was dominated by the NREM phase and only 17 min of REM sleep 532 533 could be detected in a total of 864 min (Fig. 7I). Given the limited amount of detected REM 534 sleep, its effects on hippocampal calcium activity should be interpreted with caution. As 535 reported for LFP data, NREM only mildly reduced the rate of calcium transients, whereas REM sleep induced a small increase. In contrast, both NREM and REM sleep caused a small 536 537 reduction in transient amplitude (Fig. 7K). Further, we did not detect an effect of the sleep 538 state on absolute pairwise correlations (Fig. 7L).

In conclusion, sleep and GAs similarly affect the CA1 activity. However, the magnitude of
effects was much smaller for sleep than for GAs. Both NREM and REM states were more
similar to wakefulness than to the anesthetic state. Compared to the three different anesthetics,
sleep had the closest resemblance to Iso. Thus, among the three different anesthetics, network
alterations under Iso deviate the least from natural states such as wakefulness and sleep.

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544

545 Fig. 7. Sleep alters CA1 activity in a similar way to anesthesia but with a lower magnitude. (A) 546 Classification of activity states during electrical recordings. (B) Characteristic LFP recordings during 547 wakefulness, NREM and REM sleep. (C) Line plot displaying LFP power spectra for the indicated activity 548 states. (D) Violin plot displaying the power-law decay exponent (1/f) of the LFP power spectrum. (E) 549 Raster plots of z-scored single-unit activity (SUA) for the three different activity states in four mice. Units 550 are sorted according to initial activity during wakefulness. (F) Violin plot showing SUA firing rate. (G) 551 Scatter plot showing modulation of SUA firing rate during NREM (light blue) and REM sleep (dark blue) 552 with respect to activity during wakefulness. (H) Violin plot quantifying the STTC. (I) Classification of 553 activity states during CA1 calcium imaging based on eye videography. (J) Raster plots of z-scored 554 calcium transients in an example recording of one animal transiting between wakefulness and sleep. 555 Traces are sorted by similarity. (K) Violin plots quantifying the number (left), and amplitude (right) of 556 detected calcium transients. (L) Violin plots quantifying absolute pairwise correlation of all recorded 557 neurons. White dots indicate median, vertical thick and thin lines indicate 1st-3rd quartile and interguartile 558 range, respectively. \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001 w.r.t. to wake state, n = 3-7 mice.

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### 560 Repeated anesthesia alters spine dynamics in CA1

The impact of Iso, MMF, and Keta/Xyl on CA1 activity might alter spine dynamics at CA1 pyramidal neurons. This issue is of critical relevance, since GAs disrupt activity patterns during development [58] also involving alteration of synaptic connectivity [59-61], but less is known about the impact of GAs on hippocampal synaptic structure during adulthood. So far, spine dynamics in hippocampus were only investigated under anesthesia, lacking comparison to the wake state. Moreover, the reported turnover rates varied strongly between studies [21, 62, 63]. Thus, it is unknown how repeated anesthesia in itself affects spine stability.

We repeatedly imaged the same basal, oblique, and tuft dendritic segments of CA1 pyramidal neurons under all four conditions (five times per condition, every four days), interrupted by a 30-day recovery period between conditions (Fig. 8A, S10A). To rule out time-effects, we pseudo-randomized the order of anesthetics (Fig. S10A). During wakefulness, without any anesthesia in between, the turnover ratio of spines on all dendrites was on average 18.6 - 20.5 % per four days. This turnover ratio was stable and did not change systematically over 574 successive imaging sessions (Fig. 8B). Notably, all anesthetics affected spine turnover. Both 575 MMF and Iso anesthesia mildly increased the turnover ratio compared to wakefulness (21.1 -576 23.8 % for MMF, 24.0 – 24.7 % for Iso). Iso did not alter the surviving fraction of spines. 577 Together with the significant increase in spine density over time (Fig. 8B) these results indicate 578 that the elevated turnover ratio was due to a rise in the gained fraction of spines (Fig. S10B). 579 In contrast, MMF led to a slight increase in the fraction of lost spines (Fig. S10B) and 580 correspondingly, slightly decreased the surviving fraction compared to wakefulness. Spine 581 density did not change over time. Keta/Xyl anesthesia showed the strongest effect on spine 582 turnover (13.4 - 15.7 %), which was opposite to MMF and Iso, and therefore significantly lower 583 rather than higher compared to the awake condition (Fig. 8B). This lower turnover ratio was 584 accompanied by a higher surviving fraction and an increase in density with time (Fig. 8B). Consistently, the fraction of lost spines was most strongly reduced (Fig. S10B). Thus, Keta/Xyl 585 586 anesthesia resulted in marked stabilization of existing spines and a reduction in the formation 587 of new spines, indicative of a significant effect on structural plasticity. These effects were 588 present on basal dendrites of stratum oriens (S.O.), oblique dendrites in stratum radiatum (S.R.) and tuft dendrites in stratum lacunosum moleculare (S.L.M.), albeit with different 589 590 magnitude. Under Keta/Xyl the strongest impact on spine density was present in S.L.M., while 591 turnover was most strongly reduced in S.O. Also, the increased spine turnover seen under Iso 592 and MMF was most pronounced in S.O. (Fig. S10D).

593 To rule out that the age of the animal influenced spine dynamics in the awake condition, we 594 measured spine turnover in a group of age-matched animals to the first anesthesia group (Fig. 595 S10A,C). Moreover, to rule out that the chronic imaging procedure per se and anesthesia in 596 general had a long-lasting effect on the awake imaging condition, we added another awake-597 imaging control group with naïve, age-matched animals to the awake imaging time point in the 598 experimental group (Fig. S10A,C). In all three groups, spine turnover was indistinguishable, 599 indicating that neither age nor previous imaging under anesthesia impacted spine dynamics in 600 the awake-imaging group (Fig. S10C).

601 Next, we asked whether the modulation of spine turnover by GAs was due to acute remodeling 602 of spines during the time of anesthesia. Alternatively, spine turnover might be driven by long-603 lasting changes in network activity imposed by the slow reversal of all GAs. To capture fast 604 events such as filopodia formation, we acquired image stacks every 10 min (Fig. 8C). Spine 605 turnover, survival, or density were not significantly altered during the one hour of imaging (Fig. 606 8D). Thus, spines were stable during the one hour irrespective of the treatment. While mature 607 spines typically show low elimination/formation rates over one hour, filopodia are more 608 dynamic [64-66]. Unlike other reports, that observed an acute selective formation of filopodia 609 under Keta/Xyl, but not Iso [67], we did not detect any acute effects of GAs on filopodia turnover 610 of CA1 pyramidal cell dendrites. Thus, chronic exposure to all GAs consistently impacted spine 611 dynamics, whereas acute effects were lacking. Keta/Xyl caused a strong decrease in spine 612 turnover, accompanied by a higher surviving fraction and an increased density over time.



613

614 Fig. 8. Spine turnover at CA1 pyramidal neurons is distinctly altered by repeated application of Iso, MMF and Keta/XyI. (A) Left: Schematic illustration of in vivo spine imaging strategy. In each animal, 615 616 spines were imaged on basal dendrites located in stratum oriens (S.O.), oblique dendrites in stratum 617 radiatum (S.R.) and tuft dendrites in stratum lacunosum moleculare (S.L.M.). Right: Example showing 618 an oblique dendrite in S.R. imaged chronically during all conditions. The order of anesthetic treatments 619 was pseudo-randomized between mice (see Fig. S10A). (B) Dot plots showing quantification of spine 620 turnover (left), spine survival (middle) and spine density (right) under the four indicated treatments. Note 621 that spines were imaged on the same dendrites across all conditions. Dots indicate mean  $\pm$  SEM. 622 Asterisks indicate significant differences to wakefulness in the left and middle panel. In the right panel, 623 asterisks denote significant changes within each treatment compared to day 0. \* p < 0.05, \*\* p < 0.01, 624 \*\*\* p < 0.001. (C) Imaging of acute spine dynamics during four different conditions. Left: schematic of 625 the experimental timeline. Right: example of dendrite imaged during wakefulness in 10 min intervals 626 (same dendrite as in A). (D) Dot plots showing quantification of acute spine turnover (left), spine survival 627 (center) and spine density (right) under the four indicated treatments. Dots indicate mean  $\pm$  SEM.

628

### 629 Episodic memory consolidation is impaired by MMF and Keta/Xyl, but not by Iso

Episodic memory formation and consolidation require hippocampal activity. Newly learned experiences are thought of being consolidated via replay events that co-occur with lowfrequency oscillations [49, 68-70]. In the hippocampus, these low-frequency events typically occur as sharp waves [50] during sleep, but also during awake resting behavior [70]. The above results from electrophysiological recordings and imaging showed that GAs strongly altered network oscillations in the CA1 area, in the case of MMF and Keta/Xyl, also long after 636 anesthesia discontinuation. Spine turnover of CA1 pyramidal neurons was also affected, 637 especially after Keta/Xyl administration. Therefore, we tested whether inducing anesthesia shortly after the acquisition of a new episodic memory affected its consolidation (Fig. 9A). In 638 639 line with previous experiments, we restricted Iso and MMF anesthesia to one hour, while 640 Keta/Xyl anesthesia was left to recede spontaneously. We assessed episodic-like memory with 641 a water maze protocol for reversal learning, when the hidden platform was moved to the 642 quadrant opposite the initial target location (Fig. 9A). Specifically, we tested the effects of the 643 different anesthetics on the consolidation of the memory of the new platform location. We 644 compared the performance of the mice during the probe trial done on day 3 immediately after 645 the reversal learning protocol (and 30 min before anesthesia), with the performance during the 646 probe trial on day 4, twenty-four-hours after anesthesia. During the probe trial on day 3, 647 animals of all four groups spent significantly more time in the new target guadrant compared 648 to chance (25 %), indicating that they learned the new platform position successfully (Fig. 649 9B,C).

650 On day 4, control animals that did not undergo anesthesia showed the same performance as 651 on day 3, suggesting that they had retained the memory of the new platform location (Fig. 9B,C). However, animals that were anesthetized with Keta/Xyl or MMF spent significantly less 652 653 time in the new target quadrant and showed a significantly larger mean distance to the target 654 platform position compared to the probe trial on day 3. In the Iso group, no significant difference 655 compared to day 3 was detectable (Fig. 9B,C, S11A). The impairment of memory consolidation 656 was not explained by the longer duration of recovery after Keta/Xyl or MMF compared to Iso, 657 because anesthesia for up to 4 h with Iso had no disruptive effect (Fig. S11B,C). Thus, it is not 658 the duration of the induced unconsciousness but rather the type of anesthetic that likely 659 explains the impaired memory consolidation. Notably, the effects were relatively mild, and the decrease in performance on day 4 was not significantly different between treatment groups. In 660 661 summary, consistent with long-lasting effects on CA1 network activity, Keta/Xyl, and MMF 662 impaired episodic-like memory consolidation. In contrast, Iso, which overall caused a weaker 663 disturbance of neuronal population activity and a faster recovery profile, did not significantly 664 affect memory consolidation.



665

666 Fig. 9. Episodic memory consolidation is impaired by MMF and Keta/Xyl, but not by Iso. (A) 667 Experimental design to test episodic-like memory in a Morris water maze. On days 1 and 2, animals 668 were trained to find the platform in position 1. Reversal learning was performed on day 3 where animals 669 had to learn that the platform was moved to position 2. The training was followed 30 min later by a 1-h 670 period of one of the four indicated treatments per group. On day 4, consolidation of the memory for the 671 platform in position 2 was tested. (B) Heat maps showing trajectories of all mice during the first probe 672 trial before reversal learning on day 3 (left column), after reversal learning on day 3 (middle column) and 673 after treatment on day 4 (right column). The position of the target zone is indicated by dashed circles. 674 (C) Scatter plots showing quantification of time spent in the new target quadrant (top) and distance to 675 the new platform (bottom) after reversal learning on day 3 and on day 4. Filled, colored circles indicate 676 individual animals, white circles indicate mean ± SEM. Asterisks in (C) indicate significant differences 677 between days. \* p < 0.05, \*\* p < 0.01.

678

### 679 **DISCUSSION**

We investigated and systematically compared the intra- and post-anesthetic effects of different commonly used anesthetic strategies on the mouse hippocampus across multiple levels of analysis. Despite sharing some common traits, brain and cellular network states differ substantially under the influence of various types of anesthetics [30, 71, 72]. Indeed, at the neuronal level, compared with awake state and natural sleep, all three anesthetics showed robustly reduced spiking activity in single neurons, reduced power in the high oscillation frequency band, and decorrelated cellular population activity. However, the induced network 687 states in CA1 were highly distinct between the three different conditions, with Iso leading to 688 prominent network oscillations at around 0.1 Hz, which timed the spiking activity of single units 689 and neuronal calcium transients. Keta/Xyl caused pronounced oscillations between 0.5 and 4 690 Hz and the strongest reduction in calcium dynamics. MMF, in contrast, most strongly reduced 691 LFP and SUA and impaired population dynamics for many hours as assessed with calcium 692 imaging. Differences were also present in the long-term effects on spine dynamics, with 693 Keta/Xyl stabilizing spines, leading to reduced turnover and increased density. MMF, on the 694 other hand, mildly increased spine dynamics. Keta/Xyl cannot be antagonized and therefore 695 changes of the CA1 network mediated by this anesthetic were present hours after the injection. 696 in agreement with long-lasting overall changes of global animal physiology [38]. More 697 unexpectedly, and in contrast to overall effects on physiology [38], CA1 network dynamics were still disturbed for at least 6 hours after antagonization of MMF anesthesia. These long-698 699 lasting alterations were associated with impairment of episodic memory consolidation after 700 exposure to Keta/Xyl- or MMF, but not Iso. Thus, despite all fulfilling the same hallmarks of 701 general anesthesia, different GAs distinctly alter hippocampal network dynamics, synaptic 702 connectivity, and memory consolidation.

## Iso, MMF and Keta/Xyl have different molecular targets and distinctly modulate functional and structural features of CA1

The GAs used here represent three different strategies based on the large repertoire of 705 706 currently available anesthetics. Isoflurane represents the class of halogenated diethyl ether 707 analogues, which are volatile and therefore administered via inhalation. Fentanyl, in 708 combination with the analgesic medetomidine and the sedative midazolam (MMF), represents 709 an anesthetic approach based on the injection of a combination of drugs with sedative, 710 analgesic and anxiolytic properties. In the clinic, propofol can be used instead of midazolam. 711 Finally, ketamine is used both as an anesthetic and, at a lower dosage, as a treatment against 712 depression. For anesthesia, it is generally combined with xylazine, which acts as a sedative, 713 analgesic and muscle relaxant. All three strategies differ markedly in their molecular targets. 714 Consequently, they uniquely modulate general animal physiology [38] and brain activity [72]. 715 Isoflurane is a potent GABA- and glycine receptor agonist. Moreover, it activates two-pore 716 potassium channels and acts as α-amino-3-hydroxy-5-methyl-4-isoxazolepropionic acid 717 receptor (AMPAR) inhibitor [4]. Similar to Iso, midazolam, the hypnotic component of the MMF 718 mix, mainly acts as a GABAR agonist with little effect on NMDARs. In contrast, ketamine is a 719 potent, use-dependent NMDAR blocker with less pronounced effects on potassium channels, 720 GABA, glycine and other glutamate receptors such as AMPA or kainite receptors [4]. Moreover, 721 while most anesthetics reduce the activity of thalamic nuclei, ketamine increases thalamic drive 722 [73], leading to enhanced rather than reduced oscillations in mid-to-high frequency bands such 723 as theta and gamma [28, 74]. In accordance with this, our study reveals major differences in 724 the action of the different anesthetics on functional and structural features of CA1. With both electrical recordings and calcium imaging we report a robust reduction of neuronal spiking and 725 726 pairwise neuronal correlation. Notably, effects on electrical activity and calcium activity were 727 well in line for both Iso and MMF, despite the different recording methods. However, we 728 observed some divergence for Keta/Xyl.

### 729 Comparison of electrophysiological recordings and calcium imaging

Generally, differences in electrophysiological recordings and calcium imaging data may stemfrom the location where the signal is detected. In the calcium imaging experiments, the signal

vas sampled in a horizontal plane located inside and parallel to stratum pyramidale of CA1. In

733 this configuration, somatic, action-potential driven calcium transients mainly from pyramidal 734 neurons dominate the signal. Due to the kinetics and calcium-binding properties of GCaMP6f, 735 action potentials can only be resolved below approx. 5 Hz and are reported non-linearly [46, 736 75]. In contrast, the electrodes on linear probes are arranged orthogonally to the strata of CA1 737 and parallel to the dendrites of CA1 cells. Thus, synaptic potentials mainly constitute the LFP 738 across all layers and spikes are picked up from both pyramidal cells (in stratum pyramidale) 739 and GABAergic neurons in all layers. Moreover, the first method samples neurons that spatially 740 distribute over a large area. In contrast, the second one is biased towards large, active neurons 741 that are in close proximity of the electrode.

742 More specifically, under Keta/Xvl, the overall firing rate of single units showed the smallest 743 reduction of all three anesthetics. At the same time, imaging revealed the most substantial 744 reduction in rate, amplitude and duration of calcium transients (compare Fig. 2B and 3D). One 745 reason for this discrepancy may be the inhibitory action of ketamine on NMDARs. CA1 746 pyramidal cells display large, NMDAR-driven dendritic plateau potentials and calcium spikes 747 [76]. Moreover, ketamine likely inhibits L-type voltage-gated calcium channels [77] and 748 reduces burst firing [78], leading to calcium transients with reduced amplitude and a faster 749 decay constant. In contrast, ketamine has little influence on sodium spikes and AMPAR-750 mediated synaptic potentials, which are detected in electrical recordings as SUA and LFP, 751 respectively. In accordance with electrical recordings, calcium transients showed increased 752 power at 0.1-0.2 Hz under Iso. However, we did not detect a clear peak at 1-4 Hz in the 753 presence of Keta/Xyl, as seen in LFP and SUA, probably due to its strongly dampening effect 754 on calcium transients. The (low-pass) filtering of neuronal activity imposed by calcium 755 indicators might also play a role [75].

756 Notably, the differences between electrical recordings and calcium imaging under Keta/Xyl are 757 relevant. Calcium is a second messenger central to neuronal plasticity and metabolism [79, 758 80]. NMDARs are a major source for activity-dependent calcium entry into the cell, involved in 759 regulating synaptic plasticity, metabolism, and pathology [81]. The present findings suggest 760 that Keta/Xyl has a particularly strong effect on neuronal calcium activity, uncoupling action 761 potential firing from associated cytosolic calcium transients, leading to reduced intracellular 762 calcium signaling. In contrast, calcium transients under MMF and Iso anesthesia closely 763 matched the electrical activity profile of neurons. Therefore, aside from overall effects on 764 network activity, Keta/Xyl may selectively alter neuronal plasticity by suppressing NMDAR-765 dependent postsynaptic calcium signals.

### 766 In contrast to neocortex, GAs decorrelate neuronal activity in CA1

767 All anesthetics decorrelated neuronal activity in CA1, leading to an overall fragmented network 768 state with an increased number of temporal and spatial clusters. This is in stark contrast with 769 what has been reported from studies on GAs and cortical activity both at adulthood [25-27] and during development [58]. This discrepancy may arise from the distinct architecture of CA1 770 771 compared to L2/3 of the neocortex, the latter showing a high degree of local interconnectivity 772 [47]. In CA1 this is not the case. Pyramidal cells receive their main excitatory input from CA3 and entorhinal cortex and send their efferents to subiculum and extrahippocampal areas 773 774 without making local connections among each other [9]. Afferent activity originating in various 775 sources and converging in CA1, may arrive out-of-phase under anesthesia, leading to 776 desynchronized firing of CA1 pyramidal cells. Such a phenomenon has been proposed as a 777 candidate mechanism underlying desynchronization of neuronal firing in basal ganglia under 778 conditions of slow oscillations (slow-wave sleep) and high synchrony in the neocortex [82].

Notably, the pairwise correlation was not entirely independent of the distance between neurons. Synchronization of pyramidal neurons via local, GABAergic interneurons may be another factor that increases spatial correlations. Both in the neocortex and hippocampus, various types of GABAergic interneurons locally connect to and synchronize pyramidal neurons such as basket or bistratified cells [83].

784 Coordinated neuronal network dynamics, including pairwise correlation of calcium transients 785 and single units, population coupling, clustering in the temporal and spatial domain were 786 consistently impaired most strongly with Keta/Xyl and MMF. Iso, both in electrophysiological 787 as well as calcium recordings, showed the mildest effects and permitted hippocampal activity 788 patterns that most closely resembled wakefulness and NREM/REM sleep. Iso and MMF, in 789 contrast to Keta/Xyl, are thought to be immediately reversible [38]. However, especially MMF 790 showed significant disruption of network dynamics long after reversal both in electrical 791 recordings and with calcium imaging. Antagonization of MMF failed to fully recover calcium 792 dynamics within the following 5 hours. Such long-lasting alterations might interfere with the 793 hippocampal function shortly after antagonization of MMF and must be considered when 794 performing whole-cell recordings in freely moving animals [84-86].

Since all anesthetics had a much longer effect on network activity than we expected, we asked whether this is reflected in long-term effects of these different types of anesthetics on spine dynamics of CA1 pyramidal neurons. Recent studies investigating spine dynamics at CA1 pyramidal neurons came to incongruent conclusions reporting spine turnover ranging from 3% [63] over 12% [21] to approx. 80% [62] over 4 days. However, all studies used either isoflurane [21] or ketamine/xylazine-based [62, 63] anesthesia during the repeated imaging sessions. Thus, to what extent anesthesia itself influences spine dynamics is not clear.

### 802 Iso, MMF and Keta/Xyl distinctly alter spine dynamics in CA1

803 More generally, various effects of general anesthesia on spine dynamics were reported, 804 depending on the brain region, preparation, age of the animal and anesthetic strategy. For 805 example, enhanced synaptogenesis has been reported with different types of anesthetics on 806 cortical and hippocampal neurons during development [59, 60]. In contrast, one study indicated 807 that spine dynamics were not altered on cortical neurons of adult mice with Keta/Xyl or Iso 808 [67], while another study demonstrated an increase in spine density in somatosensory cortex 809 with ketamine [87]. Also, fentanyl-mediated, concentration-dependent bidirectional 810 modulations of spine dynamics were reported in hippocampal cultures [88].

811 To systematically compare spine dynamics in CA1 in vivo under different anesthetic 812 treatments, we imaged spines at basal, obligue and tuft dendrites in a large set of dendrites. 813 We found small, but robust chronic effects of repeated anesthesia. These alterations were 814 present in all strata of CA1, consistent with a layer-independent reduction of SUA during 815 anesthesia. Keta/Xyl decreased spine turnover leading to a mild increase in spine density over 816 time by stabilizing existing spines. This observation agrees with recent studies that showed a 817 stabilizing effect of ketamine in the somatosensory cortex, resulting in increased spine density 818 [87]. Thus, repeated anesthetic doses of Keta/Xyl may limit overall synaptic plasticity and thus 819 spine turnover. It was further shown that sub-anesthetic, antidepressant doses of ketamine 820 enhance spine density in the prefrontal cortex [89, 90], similar to our study of CA1 neurons. 821 Iso and MMF had contrasting effects on spine dynamics compared to Keta/Xyl, mildly 822 enhancing spine turnover, which might be explained by their different pharmacology compared 823 to ketamine, as pointed out above. A second aspect that distinguishes Keta/Xyl from Iso and 824 MMF is its irreversibility, which might lead to longer-lasting alterations of synaptic transmission

and E/I ratios leading to differential spine dynamics. This idea is supported by the observation
that during the anesthesia period itself, spine turnover was not altered, suggesting that longlasting and repeated disturbances are required to leave a mark in synaptic connectivity.

### 828 MMF and Keta/Xyl, but not lso, retrogradely affect episodic-like memory formation

829 Sleep is a natural form of unconsciousness and is required for memory consolidation, including 830 hippocampus-dependent memories [49, 56]. Recent work suggested that sleep- and 831 anesthesia-promoting circuits differ [91, 92] while others identified circuit elements shared 832 between sleep and general anesthesia [93], especially during development [58]. Therefore, we 833 asked how the diverse alterations of CA1 network dynamics imposed by the different 834 anesthetics impact memory consolidation. In our study Iso resembled most closely network 835 states during wakefulness and natural sleep, while Keta/Xyl and MMF caused strong, lasting 836 alterations of LFP, SUA and calcium dynamics.

837 Notably, a single dose of anesthesia with Keta/Xyl and MMF, but not Iso disrupted memory 838 consolidation using a water maze assay in adult mice. Retrograde amnesia appeared to be 839 more sensitive to the magnitude than the duration of CA1 network disturbance imposed by the 840 various anesthetics. Keta/Xyl and MMF most strongly decorrelated CA1 network activity and 841 reverted only slowly. Extending the duration of Iso anesthesia up to 4 h, to match the slow 842 recovery after MMF and Keta/Xyl, did not affect memory consolidation. This observation 843 indicates that the slow recovery of network activity after Keta/Xyl and MMF alone cannot 844 explain anesthesia-mediated disruptions of memory consolidation. Instead, specific aspects of 845 the different anesthetics may selectively impact hippocampus-dependent memory formation. 846 For example, ketamine is an NMDAR blocker that has been shown to be necessary for the 847 long-term stabilization of place fields in CA1 [94], encoding of temporal information of episodes 848 [95], and formation of episodic-like memory [96].

Our results appear at odds with a report [97], where a single, 1-h treatment with Iso caused deficits in the formation of contextual fear memory, object recognition memory and performance in the Morris water maze in the following 48 h. However, this study investigated memory acquisition after anesthesia (i.e., anterograde amnesia), while our study asked whether anesthesia affects the consolidation of a memory formed shortly before the treatment (i.e., retrograde amnesia).

Changes in synaptic connections are considered essential for memory formation and storage [11-14]. Despite a small effect on spine dynamics, the strong and lasting disturbance of hippocampal network activity in CA1 (and most likely other brain areas) by Keta/Xyl and MMF was sufficient to interfere with memory consolidation. The chronic alterations of spine turnover, especially by Keta/Xyl, may therefore indicate that repeated anesthesia can impact long-lasting hippocampus-dependent memories.

To establish a direct link between spine dynamics, network disruptions and memory, future studies are required that investigate both spine turnover and changes in population coupling at hippocampal neurons causally involved in memory formation and maintenance.

Taken together, we report a novel effect of anesthesia on brain dynamics, namely fragmentation of network activity in hippocampus. We consistently observe this phenomenon across multiple levels of analysis. This unique response compared to the cortex may underlie its high sensitivity to anesthesia, including its central role in amnesia. The extent, duration, and reversibility of network fragmentation depend on the GA used. Therefore, this study may help guide the choice of an appropriate anesthetic strategy, dependent on experimental requirements and constraints, especially in the neurosciences. More generally, our findings
might also have relevance for the clinic. Postoperative delirium, a condition that involves
memory loss, is still an unresolved mystery. Minimizing the disturbance of hippocampal
function may be one building block to overcome this undesired condition.

### 875 AUTHOR CONTRIBUTIONS

	WY	MC	JAP	AF	AD	PP	CR	FM	OS	ILHO	JSW
Conceptualization											
Investigation											
Data Curation											
Analysis											
Software											
Supervision											
Funding acquisition											
Project Administration											
Writing – original draft											
Writing – revisions											

876 LEVELS OF CONTRIBUTION: MAJOR, SUPPORT

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### 885 **DECLARATION OF INTERESTS**

886 The authors declare no competing interests.

### 887 METHODS

### 888 Experimental Models and Methods

### 889 <u>Mice</u>

Adult C57BL/6J mice and transgenic Thy1-GFP-M mice of both sexes were housed and bred in pathogen-free conditions at the University Medical Center Hamburg-Eppendorf. The light/dark cycle was 12/12 h and the humidity and temperature were kept constant (40% relative humidity; 22°C). Food and water were available ad libitum. All procedures were performed in compliance with German law according and the guidelines of Directive 2010/63/EU. Protocols were approved by the Behörde für Gesundheit und Verbraucherschutz of the City of Hamburg.

897 <u>Hippocampal recording-window surgery and in-vivo electrophysiology</u>

898 Chronic multisite extracellular recordings were performed in dorsal CA1 during the dark phase 899 of the dark/light cycle, except for sleep recordings, which were done during the light period. 900 The adapter for head fixation was implanted at least 4 days before recordings. Mice were 901 anesthetized via intraperitoneal injection of midazolam/medetomidine/fentanyl (MMF) and 902 placed on a heating blanket to maintain the body temperature. Eyes were covered with eye 903 ointment (Vidisic, Bausch + Lomb) to prevent drying. Prior to surgery, the depth of anesthesia 904 and analgesia was evaluated with a toe-pinch to test the paw-withdrawal reflex. Subsequently, 905 mice were fixed in a stereotactic frame, the fur was removed with a fine trimmer and the skin 906 of the head was disinfected with Betaisodona. After removing the skin, 0.5% bupivacaine / 1% 907 lidocaine was locally applied to cutting edges. A metal head-post (Neurotar) was attached to 908 the skull with dental cement (Super Bond C&B, Sun Medical) and a craniotomy was performed 909 above the to the dorsal CA1 area (-2.0 mm AP,  $\pm$  1.3 mm ML relative to Bregma) which was 910 subsequently protected by a customized synthetic window filled with Kwik-Cast sealant (World 911 Precision Instruments). After recovery from anesthesia, mice were returned to their home cage 912 and were provided with Meloxicam mixed into soft food for 3 days. After recovery from the 913 surgery, mice were accustomed to head-fixation and trained to move in the Mobile HomeCage 914 system (Neurotar). For recordings, craniotomies were reopened by removal of the Kwik-Cast 915 sealant and multi-site electrodes (NeuroNexus, MI, USA) were inserted into the dorsal CA1 916 (one-shank, A1x16 recording sites, 50 µm spacing, 1.6 mm deep). A silver wire served as 917 ground and reference in the craniotomy between skull and brain tissue. Extracellular signals 918 were band-pass filtered (0.1-8000 Hz) and digitized (32 kHz) with a multichannel extracellular 919 amplifier (Digital Lynx SX; Neuralynx). The same animals were recorded weekly under different 920 anesthesia. After 15 min of non-anesthetized recording, mice received a subcutaneous 921 injection of Keta/Xyl, MMF or inhalation of Iso in a pseudo-randomized order. The following 922 drug combinations were administered: 2.0 % isoflurane in 100% O<sub>2</sub>; 130 mg/kg ketamine, 10 mg/kg xylazine s.c.; 5.0 mg/kg midazolam, 0.2 mg/kg medetomidine and 0.05 mg/kg fentanyl 923 924 s.c.; and for complete reversal of anesthesia, 0.5 mg/kg flumazenil, 2.5 mg/kg atipamezole and 925 0.1 mg/kg buprenorphine s.c. Recordings were conducted for 1.5 h. After recordings, the 926 craniotomy was closed and mice were returned to their home cage. Electrode position was 927 confirmed in brain slices postmortem.

### 928 <u>EMG recordings</u>

929 Electromyography (EMG) electrodes for sleep state classification were implanted during 930 hippocampal recording-window surgery. Two gold plates (~3 mm diameter) soldered to epoxy 931 lacquered wires and attached to a connector were inserted into the right and left nuchal 932 muscles and fixed with dental cement (Super Bond C&B, Sun Medical). For EMG recordings, 933 a cable was attached to the implanted connector and directly digitized (32 kHz) and band-pass 934 filtered (8-8000 Hz) through a customized break-out channel board with a multichannel 935 amplifier (Digital Lynx SX; Neuralynx). EMG recordings were done at least for 1 h 45 min in 936 non-anesthetized mice without disturbances. Mice were recorded 1-2 times.

### 937 Virus injection and hippocampal window surgery for in vivo calcium imaging

938 C57BL/6J wild-type mice were anesthetized via intraperitoneal injection of 939 midazolam/medetomidine/fentanyl (MMF) and placed on a heating blanket to maintain the 940 body temperature. Eyes were covered with eye ointment (Vidisic, Bausch + Lomb) to prevent 941 drying. Prior to surgery, the depth of anesthesia and analgesia was evaluated with a toe-pinch 942 to test the paw-withdrawal reflex. Subsequently, mice were fixed in a stereotactic frame, the 943 fur was removed with a fine trimmer and the skin of the head was disinfected with Betaisodona. 944 The skin was removed by a midline scalp incision (1-3 cm), the skull was cleaned using a bone 945 scraper (Fine Science Tools) and a small hole was drilled with a dental drill (Foredom) above 946 the injection site. AAV2/7-syn-GCaMP6f was targeted unilaterally to the dorsal CA1 area (-947 2.0 mm AP, ± 1.3 mm ML, - 1.5 mm DV relative to Bregma). 0.6 µl of virus suspension was 948 injected. All injections were done at 100 nl\*min<sup>-1</sup> using a glass micropipette. After the injection, 949 the pipette stayed in place for at least 5 min before it was withdrawn and the scalp was closed 950 with sutures. For complete reversal of anesthesia, mice received a subcutaneous dose of Flumazenil, Atipamezole and Buprenorphine (FAB). During the two days following surgery 951 952 animals were provided with Meloxicam mixed into soft food. Two weeks after virus injection, 953 mice were anesthetized as described above to implant the hippocampal window. After fur

954 removal, skin above the frontal and parietal bones of the skull was removed by one horizontal 955 cut along basis of skull and two rostral cuts. The skull was cleaned after removal of the 956 periosteum, roughened with a bone scraper and covered with a thin layer of cyanoacrylate 957 glue (Pattex). After polymerization a 3-mm circle was marked on the right parietal bone 958 (anteroposterior, -2.2 mm; mediolateral, +1.8 mm relative to bregma) with a biopsy punch and 959 the bone was removed with a dental drill (Foredom). The dura and somatosensory cortex 960 above the hippocampus were carefully aspirated until the white matter tracts of the corpus 961 callosum became visible. The craniotomy was washed with sterile PBS and a custom-built 962 imaging window was inserted over the dorsal hippocampus. The window consisted of a hollow glass cylinder (diameter: 3 mm, wall thickness: 0.1 mm, height: 1.8 mm) glued to a No. 1 963 964 coverslip (diameter: 3mm, thickness: 0.17 mm) on the bottom and to a stainless-steel rim on 965 the top with UV-curable glass glue (Norland NOA61). The steel rim and a head holder plate 966 (Luigs & Neumann) were fixed to the skull with cyanoacrylate gel (Pattex). After polymerization, cranial window and head holder plate were covered with dental cement (Super Bond C&B, 967 968 Sun Medical) to provide strong bonding to the skull bone. Following the surgery, animals were 969 provided with Meloxicam mixed into soft food for 3 days. The position of the hippocampal 970 window was confirmed in brain slices postmortem.

### 971 <u>Two-photon calcium imaging in anesthetized and awake mice</u>

972 The same animals were sequentially imaged under Keta/Xyl, MMF or Iso in a pseudo-973 randomized order during the dark phase of the dark/light cycle (for details, see above). After 974 losing the righting reflex, generally 5–10 min after application of the anesthetics, the animals 975 were positioned on a heating-pad to maintain body temperature at approximately 37°C during 976 anesthesia. The intensity of anesthesia and evaluation of the different stages of anesthesia 977 were assessed by recording the presence or absence of distinct reflex responses: righting 978 reflex, palpebral reflex, toe-pinch reflex. Between each imaging session, mice were allowed to 979 recover for one week.

980 Anesthetized mice were head-fixed under the microscope on a heated blanket to maintain 981 body temperature. Eyes were covered with eye ointment (Vidisic, Bausch + Lomb) to prevent 982 drying. The window was centered under the two-photon microscope (MOM-scope, Sutter 983 Instruments, modified by Rapp Optoelectronics) and GCaMP6f expression was verified in the 984 hippocampus using epi fluorescence. Images were acquired with a 16x water immersion objective (Nikon CFI75 LWD 16X W, 0.80 NA, 3.0 mm WD). For awake imaging we used a 985 986 linear treadmill, which allowed imaging during quiet and running states. 5-min-timelapse 987 images were acquired every 10 minutes for a period of 50 minutes. Only quiet periods were 988 considered for analysis in this study. Image acquisition was carried out with a Ti:Sa laser 989 (Chameleon Vision-S, Coherent) tuned to 980 nm to excite GCaMP6f. Single planes (512x512) 990 pixels) were acquired at 30 Hz with a resonant-galvanometric scanner at 29-60 mW (980 nm) using ScanImage 2017b (Vidrio). Emitted photons were detected by a pair of photomultiplier 991 992 tubes (H7422P-40, Hamamatsu). A 560 DXCR dichroic mirror and a 525/50 emission filter 993 (Chroma Technology) was used to detect green fluorescence. Excitation light was blocked by 994 short-pass filters (ET700SP-2P, Chroma). For the repetitive imaging, the position of the field 995 of view (FOV) was registered in the first imaging session with the help of vascular landmarks 996 and cell bodies of CA1 pyramidal neurons. This allowed for subsequent retrieval of the FOV for each mouse. 997

998 Calcium imaging experiments to measure recovery from anesthesia were done in five 999 additional animals. They were trained to maintain immobile on the treadmill for extended 1000 periods. We ensured to measure the same FOV and to maintain overall stability of 1001 fluorescence intensity for every recording in each imaging session for a given animal. The 1002 time-lapse recordings were extended to up to a maximum of 10 min per time point to have a 1003 higher probability of capturing motionless periods continuously, in awake and recovery states. 1004 Iso was applied for 60 min. FAB was injected 60 min after the application of MMF. Keta/Xyl 1005 was not antagonized. Imaging of calcium activity was performed before, 0.5, 1.5, 2, 3, 4, 5, 1006 and 6 hours after induction of anesthesia. For Iso and MMF, the 1.5 h time point represented 1007 the first imaging session after reversal. Untreated control animals were imaged every hour for 1008 the same amount of time.

1009 To habituate mice to sleep under head-fixation, we used a linear treadmill, which allowed the 1010 mice to move at will. Through the first 4 sessions mice were kept head-fixed for 15 to 30 min. 1011 In ten following sessions the fixation period was extended up to 4h with increasing intervals of 1012 30 min. The state of the mouse was continuously monitored with a USB camera and the 1013 running speed was recorded with custom-written scripts in the Matlab. After habituation to 4h 1014 head-fixation, sleep imaging sessions were recorded, which were synchronized with 1015 recordings of the pupil and running speed. Sleep imaging was performed during the light phase 1016 of the dark/light cycle.

### 1017 <u>Two-photon spine imaging in anesthetized and awake mice</u>

1018 3 - 4 weeks after window implantation, chronic spine imaging started in Tg(Thy1-EGFP)MJrs/J 1019 mice with the first of a total of four imaging series (see Fig. S10A). Each imaging series was 1020 done under one of the three anesthetic conditions (Iso, Keta/Xyl, MMF, see above for details) 1021 or during wakefulness. Within one series, mice were imaged 5 times every 4 days. Afterwards, 1022 mice were allowed to recover for three to four weeks until the next imaging series under a 1023 different anesthetic condition was started. Thus, each experiment lasted approx. 5 months. To 1024 avoid time-dependent effects, anesthetic conditions were pseudo-randomized (see Fig. S10A). 1025 For imaging sessions under anesthesia mice were head fixed under the microscope on a heated blanket to maintain body temperature. Eyes were covered with eye ointment (Vidisic, 1026 1027 Bausch + Lomb) to prevent drying. The window was centered under the two-photon 1028 microscope (MOM-scope, Sutter Instruments, modified by Rapp Optoelectronics) and GFP 1029 expression was verified in the hippocampus using epi-fluorescence. Image acquisition was 1030 carried out with a Ti:Sa laser (Chameleon Vision-S, Coherent) tuned to 980 nm to excite GFP. 1031 Images were acquired with a 40x water immersion objective (Nikon CFI APO NIR 40X W, 0.80 1032 NA, 3.5 mm WD). Single planes (512x512 pixels) were acquired at 30 Hz with a resonant 1033 scanner at 10-60 mW (980 nm) using ScanImage 2017b. Before the first imaging session, we 1034 registered the field of views with the help of vascular landmarks and cell bodies of CA1 1035 pyramidal neurons and selected several regions for longitudinal monitoring across the duration 1036 of the time-lapse experiment. Each of these regions contained between 1 and 2 dendritic 1037 segments visibly expressing GFP. The imaging sessions lasted for max 60 min and mice were 1038 placed back to their home cages where they woke up.

### 1039 Morris Water Maze

We designed a protocol for reversal learning in the spatial version of the water maze to assess the possible effects of the different anesthetics on episodic-like memory in mice [98, 99]. The water maze consisted of a circular tank (145 cm in diameter) circled by dark curtains and walls. The water was made opaque by the addition of non-toxic white paint such that the white platform (14 cm diameter, 9 cm high, 1 cm below the water surface) was not visible. Four landmarks (35 X 35 cm) differing in shape and grey gradient were positioned on the wall of the maze. Four white spotlights on the floor around the swimming pool provided homogeneous 1047 indirect illumination of 60 lux on the water surface. Mice were first familiarized for one day to 1048 swim and climb onto a platform (diameter of 10 cm) placed in a small rectangular maze (42.5 1049 x 26.5 cm and 15.5 cm high). During familiarization, the position of the platform was 1050 unpredictable since its location was randomized, and training was performed in darkness. After 1051 familiarization, mice underwent three learning days, during which they had to learn the location 1052 of a hidden platform. The starting position and the side of the maze from which mice were 1053 taken out of the maze were randomized. On day 1, mice underwent four learning trials 1054 (maximum duration of 90 seconds, inter-trial interval of 10 minutes). After staying on the 1055 platform for 15 s, mice were returned to their home cage and warmed up under red light. On 1056 day 2, mice underwent two training trials before they performed a 60 seconds-long probe trial 1057 to assess their searching strategy. Afterwards, one additional training trial was used to reconsolidate the memory of the platform position, and mice were distributed into four groups 1058 with a similar distribution of performance. On day 3, the long-term memory of the platform 1059 1060 position was tested with a 45-seconds long probe trial, followed by another training trial with 1061 the platform in place to avoid extinction. Then mice underwent four reversal learning trials with 1062 the platform located in the quadrant opposite the one in which the platform was during the previous training trials. To assess whether the mice learned the new platform position, mice 1063 1064 underwent a 60-seconds long probe trial followed by one more training trial to consolidate the 1065 memory of the new location. One hour after the last reversal learning trial, mice were 1066 anesthetized to analyze the effects of the anesthesia on the consolidation of the memory of 1067 the new platform position. Mice were assigned to four groups with an equal average 1068 performance during the probe trial on day 2. Each group was subjected to different conditions: 1069 one-hour Iso anesthesia, one-hour MMF anesthesia, Keta/Xyl anesthesia (which was not 1070 antagonized), and one group was left untreated. On day 4, mice underwent a 60-seconds long 1071 probe trial to evaluate their searching strategies; namely, the "episodic-like memory" of the 1072 reversal learning trials performed one hour before having been anesthetized on day 3 (see Fig. 1073 9A).

### 1074 Quantification and Statistical Analysis

### 1075 <u>Electrophysiology</u>

1076 In vivo electrophysiology data were analyzed with custom-written scripts in the Matlab 1077 environment available at <u>https://github.com/mchini/HanganuOpatzToolbox</u>. We selected the 1078 recording site in the pyramidal layer of CA1. Data were band-pass filtered (1-100 Hz or 0-1079 100 Hz for low frequency LFP analysis) using a third-order Butterworth forward and backward 1080 filter to preserve phase information before down-sampling to analyze LFP.

1081Detection of active periods. Active periods were detected with an adapted version of an1082algorithmforrippledetection

(https://github.com/buzsakilab/buzcode/blob/master/detectors/detectEvents/bz FindRipples. 1083 1084 m). Briefly, active periods were detected on the band-pass filtered (4-20 Hz) normalized 1085 squared signal using both absolute and relative thresholds. We first passed the signal through 1086 a boxcar filter and then performed hysteresis thresholding: we first detected events whose 1087 absolute or relative power exceeded the higher threshold, and considered as belonging to the 1088 same event all data points that were below the lower (absolute or relative) threshold. Absolute 1089 thresholds were set to 7 and 15 µV, relative thresholds to 1 and 2. Periods were merged if 1090 having an inter-period interval shorter than 900 ms, and discarded if lasted less than 500 ms. 1091 Percentage of active periods was calculated for 15 min bins. Timestamps were preserved for 1092 further analysis.

- Power spectral density. Power spectral density was calculated on 30 s-long windows of 0-100
   Hz filtered signal using Welch's method with a signal overlap of 15 s.
- 1095 *Modulation index (MI).* Modulation index was calculated as (value anesthesia value pre-1096 anesthetized) / (value anesthesia + value pre-anesthetized).
- 1097 Power law decay exponent of the LFP power spectrum. The 1/f slope was computed as in [36].
  1098 We used robust linear regression (Matlab function *robustfit.m*) on the log10 of the LFP power
  1099 spectrum in the 30-50 Hz frequency range.
- 1100 Phase-amplitude coupling (PAC). PAC was calculated on 0-100 Hz filtered full signal using the
- 1101 PAC toolbox based on modulation index measure [100]. Range of phase vector was set to 0-
- 1102 8 Hz and range of amplitude vector was set to 20-100 Hz. Significant coupling was calculated
- 1103 in comparison to a shuffled dataset. Non-significant values were rejected.
- 1104 *Single unit analysis.* Single unit activity (SUA) was detected and clustered using klusta [101] 1105 and manually curated using phy (<u>https://github.com/cortex-lab</u>).
- 1106 *Active units:* the recording was divided into 15-minute bins. Single units were considered to be 1107 active in the time interval if they fired at least five times.
- 1108 *Pairwise phase consistency.* Pairwise phase consistency (PPC) was computed as previously
- 1109 described [102]. Briefly, the phase in the band of interest was extracted as mentioned above,
- 1110 and the mean of the cosine of the absolute angular distance (dot product) among all single unit
- 1111 pairs of phases was calculated.
- 1112 *Unit Power.* SUA spike trains of each recording were summed in a population vector, and 1113 power spectral density was calculated on 30 s-long windows using Welch's method with a 1114 signal overlap of 15 s. The resulting power spectra were normalized by the firing rate in that 1115 window.
- 1116 *Spike-Time tiling coefficient* (STTC) was computed as previously described [52]. Briefly, we 1117 quantified the proportion ( $P_A$ ) of spikes of spike train A that fall within ± $\Delta$ t of a spike from spike 1118 train B. To this value we subtract the proportion of time that occurs within ± $\Delta$ t of spikes from 1119 spike train B ( $T_B$ ). This is then divided by 1 minus the product of these two values. The same 1120 is then applied after inverting spike train A and B, and the mean between the two values is 1121 kept.
- 1122  $STTC = \frac{1}{2} \left( \frac{P_A T_B}{1 P_A T_B} + \frac{P_B T_A}{1 P_B T_A} \right)$
- Importantly, this coefficient has several desirable properties. It is bounded between -1 and 1. 1123 1124 It is symmetric with respect to the two spike trains. Computing it over different timescales is 1125 readily done by controlling the value of the parameter "\Deltat". Lastly, and most importantly, 1126 traditionally used methods of assessing correlations between pairs of spike trains show an 1127 inverse correlation between their value and firing rate, due to the fact that spiking is sparse 1128 with respect to the sampling frequency, and therefore quiescent period in both spike trains 1129 artificially increase the correlation. This is not the case for the spike-time tiling coefficient [52]. 1130 Given that there are large differences in the average firing rate of our conditions, we chose 1131 STTC analysis over pure correlation analysis to circumvent this major bias. On the flipside, 1132 STTC cannot be straightforwardly applied to negative correlations, that were therefore not 1133 investigated in SUA data.
- 1134 Calcium imaging data

1135 In vivo calcium imaging data were analyzed with custom-written scripts in the Python and 1136 Matlab environment available at <u>https://github.com/mchini/Yang Chini et al</u>.

Alignment of multiple recordings. To track the activity of the same set of neurons in different anesthetic conditions and during wakefulness, we acquired two-photon time series of a defined field of view for each animal and each condition across multiple weeks. Over such long time periods, the field of view was susceptible to geometrical transformations from one recording to another and thus, any two time series were never perfectly aligned. This problem scaled with time that passed between recordings. However, optimal image alignment is critical for the successful identification and calcium analysis of the same neurons across time [103, 104].

1144 To address this problem, we developed an approach based on the pystackreg package, a 1145 Python implementation of the ImageJ extension TurboReg/StackReg [105]. The source code 1146 that reproduces the procedure described in this section is available on github 1147 (https://pypi.org/project/pystackreg/). The pystackreg package is capable of using different 1148 combinations of geometrical transformations for the alignment. We considered rigid body 1149 (translation + rotation + scaling) and affine (translation + rotation + scaling + shearing) 1150 transformation methods, which we applied to mean and enhanced-mean intensity images generated by Suite2p during the registration of each single recording. We performed the 1151 1152 alignment using all four combinations (2 transformations x 2 types of images) choosing the one 1153 with the best performance according to the following procedure. Squared difference between 1154 the central part of a reference and aligned image served as a distance function d to quantify 1155 the alignment (since the signal is not always present on the borders of the image they were truncated): 1156

$$d = \sum_{i,j}^{Tranc.} (x_{i,j}^{ref} - x_{i,j}^{aligned})^2,$$

where  $x_{i,j}^{ref}$  and  $x_{i,j}^{aligned}$  are intensities of the pixel with coordinates *i*, *j* of the reference and 1158 1159 aligned images. The combination with the smallest score was chosen for the final 1160 transformation. In some rare cases, the algorithm of the alignment did not converge for a given 1161 transformation method and image type (mean or enhanced-mean), crumbling the aligned image in a way that most of the field of view remained empty. This combination may have the 1162 1163 smallest distance function d and may be falsely identified as the best one. To overcome this 1164 issue, an additional criterion was applied, which requires the central part of the aligned picture 1165 to contain more than 90 % of the non-empty pixels. The overall performance of the algorithm 1166 was verified by visual inspection. An example of the alignment of two recordings is shown in Fig. S5. The alignment for all recordings of an example mouse is demonstrated in a 1167 1168 supplementary video (Supplementary\_video\_37529\_aligned\_recordings.avi).

1169 In case of relatively small distortions across recordings, for example, when consecutive 1170 acquisitions were done within one imaging session, registration can alternatively be performed 1171 simultaneously with ROI detection in Suite2p by concatenating those TIFF-stacks. In this 1172 approach, every ROI is automatically labeled with the same identification number across all 1173 recordings.

1174 Identification of the same neurons across different recordings & unique neuron ID assignment.
1175 After the alignment procedure, we set out to identify neurons which were active across multiple
1176 recordings (and thus, multiple conditions). To achieve this, we developed an algorithm similar
1177 to the one described in Sheintuch. et al. 2017 [104]

1178 The algorithm processes in series all recordings for a given animal and assigns unique 1179 identification (ID) numbers to each ROIs of every recording. Since the recordings under Iso-1180 anesthesia had the largest number of active neurons, we chose the first recording of this 1181 condition as reference. We assigned IDs that ranged from 1 to the total amount of neurons to all the ROIs of this recording. For every other recording of each mouse, Neuron ID assignment 1182 1183 consisted of: 1. comparison of the properties (details below) of each ROI with each ROI that 1184 had already been processed. 2a. If the properties of the ROI matched the properties of an ROI from a previously analyzed recording, the ROI received the same Neuron ID. 2b. If no match 1185 1186 was found, a new (in sequential order) Neuron ID was assigned to the ROI. In order to be 1187 identified as representing the same neuron in two different recordings, two ROIs had to respect 1188 the following criteria: the distance between their centroids had to be below 3 µm, and the overlap between their pixels had to be above 70%. An example of the identification of unique 1189 1190 neuron pairs in two recordings is presented in Fig. S6A. The thresholds were chosen based 1191 on the distribution of the distances between centroids and percentage of the overlaps. An 1192 example for a single mouse is graphically illustrated in Fig. S6B. Both properties have a clearly bimodal distribution (similar to [104]) with cutoffs close to the chosen thresholds. 1193

Signal extraction and analysis. Signal extraction, correlation and spectral analysis for calcium
 signal was performed using Python (Python Software Foundation, NH, USA) in the Spyder
 (Pierre Raybaut, The Spyder Development Team) development environment. Calcium imaging

- 1197 data were analyzed with the Suite2p toolbox [106] using the parameters given in table 1.
- 1198

Parameter	Variable	Value
Sampling rate, frames per second	fs	30
Registration		
Subsampled frames for finding reference image	nimg_init	2000
Number of frames per batch	batch_size	200
Maximum allowed registration shift, as a fraction of frame max(width and height)	maxregshift	0.1
Precision of subpixel registration (1/subpixel steps)	subpixel	10
Smoothing	smooth_sigma	1.15
Bad frames to be excluded	th_badframes	100.0
Non-rigid registration		
Use nonrigid registration	nonrigid	True
Block size to register (** keep this a multiple of 2 **)	block_size	[128,128]
if any nonrigid block is below this threshold, it gets smoothed until above this threshold. 1.0 results in no smoothing	snr_thresh	2.0
maximum pixel shift allowed for nonrigid, relative to rigid	maxregshiftNR	10

Cell detection		
Run ROI extraction	roidetect	True
Run sparse_mode	sparse_mode	False
Diameter for filtering and extracting	diameter	12.0
Keep ROIs fully connected (set to 0 for dendrites)	connected	True
Maximum number of binned frames for cell detection	nbinned	5000
Maximum number of iterations to do cell detection	max_iterations	20
Adjust the automatically determined threshold by this scalar multiplier	threshold_scaling	1.0 or 0.1
Cells with more overlap than this get removed during triage, before refinement	max_overlap	0.75
Running mean subtraction with window of size 'high_pass'	high_pass	100
ROI extraction		
Number of pixels to keep between ROI and neuropil donut	inner_neuropil_radius	2
Minimum number of pixels in the neuropil	min_neuropil_pixels	100
Pixels that are overlapping are thrown out (False) or added to both ROIs (True)	allow_overlap	True
Deconvolution		
Deconvolution time constant, seconds	tau	0.7

### 1199

1200 The same analytical pipeline was applied to both the raw fluorescence traces as well as the 1201 deconvolved ("spikes") signal, as extracted by the Suite2p toolbox. Generally, the raw fluorescence signal was preferred over the deconvolved one given that its extraction is more 1202 straightforward and relies on less assumptions. However, while the reported effects varied in 1203 1204 magnitude depending on which of the two signals was considered, the same results were 1205 obtained on both datasets. The effects were entirely consistent. For raw signal analysis of each 1206 neuron, previous to any further step, we subtracted 0.7 of the corresponding neuropil fluorescence trace. 1207

The number and height of calcium transients properties were calculated with the scipy function find\_peaks on the raw calcium traces with the following parameters: height = 200, distance = 10 and prominence = 200. The decay was computed on the 10 best-isolated transients of each neuron, using the *OASIS* toolbox (<u>https://github.com/j-friedrich/OASIS</u>). We used the deconvolve function with the following parameters: penalty = 0, optimize\_g = 10. Traces with an estimated decay over 2 seconds were considered cases of failed extraction and removed from further analysis. 1215 The choice of the parameter values for transient detection is somewhat arbitrary. Similarly, it 1216 is debatable whether and how the calcium traces should best be normalized. Therefore, we 1217 tested the robustness of our findings by systematically varying signal extraction choices. We 1218 first varied the height and prominence threshold across a wide range of values (50 to 700 1219 arbitrary units). We further computed transients features on normalized  $\Delta F/F$  calcium traces. To normalize calcium signals, we used the baseline value as extracted by the deconvolve 1220 1221 function. Also, in this case, we varied the height and prominence threshold across a wide range 1222 of values (0.5 to 3 arbitrary units). Finally, we computed two measures of neuronal activity that 1223 are independent of calcium transients detection: the average of the trace integral and its 1224 standard deviation, with and without normalization. Across all of these scenarios, the reported 1225 effects were robustly consistent.

- 1226 Correlations were computed both as Pearson (numpy function *corrcoeff*) and Spearman 1227 (custom written function) coefficient on the z-scored signal. To both sets of coefficients, the 1228 Fisher correction (the inverse of the hyperbolic tangent function, numpy function *arctanh*) was 1229 applied. For power analysis, we first created a population activity vector by summing all the 1230 single neuron z-scored signals, and then estimated the power spectral density by applying the 1231 Welch method (sampling frequency = 30 Hz, number of points for fast Fourier transformation 1232 = 1024, no overlap, window length = 1 s).
- 1233 For analysis of recovery from anesthesia, all recordings of the imaging session for a given 1234 animal were concatenated in Suite2p. As a consequence, each recording in the imaging 1235 session has the same set of reconstructed neurons. A time window of 5000 frames was used 1236 for the analysis to ensure continuous motionless periods. To track the neuronal activity 1237 changes, the number of fluorescence peaks, their amplitude, and the characteristic decay 1238 constant of the transients were considered. Each imaging session's threshold was chosen to match the median activity in the pre-anesthesia (awake) state across all animals. To assess 1239 1240 the relative changes of these parameters induced by anesthesia and their subsequent 1241 recovery over time, the parameters were normalized to their median value at the pre-1242 anesthesia (awake) state. Notably, we focused our analysis on neurons that maintained some 1243 detectable activity during anesthesia, and neurons with no detected peaks were excluded from 1244 the distributions. Additionally, we applied the cut decay constant > 1/30 [s] (where 30 frames 1245 per second is an acquisition rate) to remove the traces where the OASIS algorithm considered 1246 a single noise peak to be a calcium transient.
- 1247 Complexity analysis was performed in the Matlab (MathWorks) environment. For complexity 1248 analysis, we limited the number of neurons to the minimum  $(N_{min})$  present in any recording of 1249 any condition for each single mouse (median = 265, min = 156, max = 1068). The resulting 1250 matrix therefore had the TrecxNmin dimensions, where Trec represents the time vector for the recording, with a length of 5 min and a sampling rate of 30 Hz. For recordings that had a 1251 1252 number of neurons larger than  $N_{min}$  for that mouse, we randomly sampled  $n = N_{min}$  neurons 1253 and repeated the analysis 5 times. For every extracted parameter, we then considered the 1254 median value over the 5 repetitions. For further analysis, the signal was down sampled from 1255 the original sampling frequency of 30 Hz to 10 Hz (100 ms bins). The same analytical pipeline 1256 was then applied to both the raw fluorescence traces, as well as the deconvolved signal.

*tSNE clustering.* tSNE clustering was performed similar to [26]. Briefly, in a range between 5
and 45, the perplexity value that minimized the reconstruction error was selected. The number
of PCA components used for this step was limited to 30. For the raw fluorescence signal,
Euclidian distance was used, whereas for the deconvolved signal we opted for cosine distance,
as it is better suited to a sparse signal. We computed the probability distribution of the resulting

1262 embedded matrix (2xT<sub>rec</sub>), that was then convolved with a 2D Gaussian window (standard 1263 deviation was set to be equal to 1/40 of the total maximum value). To evaluate the number of 1264 clusters in the distribution, we then applied a series of standard steps in image analysis: 1265 background subtraction with the rolling ball method, smoothing with a median filter, 1266 thresholding, watershedding to avoid undersegmentation, and extended minima 1267 transformation. Finally, the exterior boundaries of the objects were traced and counted. This 1268 gave the number of clusters.

1269Affinity Propagation Clustering (APC). Affinity Propagation clustering was performed using a1270Matlab toolbox [https://www.psi.toronto.edu/index.php?q=affinity%20propagation] and1271similarly to [26]. We first obtained a distance map, which was computed as 1 minus the1272pairwise cosine distance between observations of the  $T_{rec}xN_{min}$  matrix. This distance matrix1273was then fed to the affinity propagation algorithm with the input preference set equal to the1274median of the distance matrix.

- Principal Component Analysis (PCA) clustering and variance explained. Standard PCA was
   applied to the T<sub>rec</sub>xN<sub>min</sub> matrix. The number of clusters was computed as the number of
   components that was needed to cumulatively explain 90% of the variance of the input matrix.
   Further, we computed the loglog decay coefficient of number of components versus variance
   explained.
- 1280 Community detection. To detect communities, we used the Louvain algorithm from the Brain 1281 Connectivity Toolbox (https://sites.google.com/site/bctnet/), a modularity maximization 1282 procedure widely used in studies examining brain networks [107]. This approach aims at 1283 subdividing the network into partitions that are more internally dense than would be expected 1284 by chance [53]. As input to the algorithm, we used Fisher-transformed correlation matrices 1285 obtained from calcium imaging time-series. Matrices were not thresholded, and both positive 1286 and negative correlations were taken into account to determine optimal modular partitions. The 1287 algorithm was evaluated while varying the resolution parameter gamma between 0 and 3, in steps of 0.1. For the multiresolution approach and hierarchical consensus clustering, data was 1288 1289 analyzed using code available at https://github.com/LJeub/HierarchicalConsensus and 1290 according to the procedure described in [55]. The number of communities detected by the 1291 finest level partition of the consensus hierarchy was used for further analysis. While neurons 1292 in the awake condition tended to be spatially closer to each other than for the other conditions 1293 (Fig. S8E), this is unlikely to have influenced the results of the analysis, as the difference was 1294 minimal and there was no correlation between median distance in a recording and the number 1295 of detected communities (Fig. S8F).
- 1296 Sleep scoring

1297 Sleep scoring was carried out in two steps. We first used electrophysiological features (see 1298 below) to classify the behavioral state of the electrophysiological recordings. Then, using this 1299 dataset as ground truth, we extracted pupil/eyelid features that we used to extend our 1300 classification to the calcium imaging recordings.

*Electrophysiological recordings.* We divided the signal in 30s epochs with a 50% overlap, and used a rule-based approach similar to that applied in [57, 108]. NREM sleep epochs were defined as epochs having LFP power in the delta band (1-4 Hz) higher than the 70<sup>th</sup> percentile, EMG broadband (30-300 Hz) power lower than the median, and no movement. REM sleep epochs were defined as epochs having a ratio between theta (6-12 Hz) and delta LFP power higher than the 70<sup>th</sup> percentile, EMG broadband power lower than the 25<sup>th</sup> percentile, and no movement. Finally, wakefulness epochs were defined as epochs having EMG broadband

power that exceeded the 80<sup>th</sup> percentile or with mouse movement. Given that this rule-based 1308 1309 approach left ~49% of the epochs as unclassified, we extended this classification with a 1310 machine-learning approach using the scikit-learn toolbox [109]. Using the classified epochs as 1311 the labelled dataset, we trained a K-nearest neighbors classifier (number of neighbors=20, 1312 weights=distance, algorithm=auto, leaf size=5, p=2, scoring=f1 macro) to which we fed the 1313 following quantile-transformed (quantiles=20) features: LFP power in the delta and theta band, 1314 ratio between LFP delta and theta power, EMG broadband power and average movement. 1315 After training, the algorithm was asked to predict the unclassified epochs. Predictions that were 1316 done with a probability estimate above 99% were kept, the others were left as unclassified. 1317 This adjunction to the rule-based approach allowed us to lower the percentage of unclassified 1318 (uncertain) epochs to ~28%.

- 1319 Pupil and eyelid analysis. During electrophysiological recordings, the eye of the mouse was 1320 recorded with a monochrome, infrared sensitive camera (UI-3360CP-NIR-GL Rev. 2, iDS 1321 imaging, Germany, objective: LMZ45T3 2/3" 18-108mm/F2.5 manual macro zoom lens, Kowa, 1322 Germany) under red light. Videos were captured with the uEye Cockpit software (iDS imaging, 1323 Germany) with a framerate of 30 Hz. Pupil, EMG and electrophysiological recordings were 1324 synchronized with a customized light/digital pulse shutter. During calcium imaging recordings 1325 were done with a, infrared sensitive camera (DMK 33UX249; The Imaging Source, Germany) 1326 equipped with a macro objective (TMN 1.0/50; The Imaging Source, Germany) at a frame rate 1327 of 10 Hz. Contours of the mouse eye were tracked using the deep neural network-based 1328 software module DeepLabCut [110] and subsequently processed in MATLAB. We trained a 1329 neural network (residual neural network, 152 layers, 200,000 iterations) to detect the upper, 1330 lower, left, and right edges of the pupil and eyelid, respectively, in images down-sampled to 1331 256 pixels on the shorter edge (n = 1038 frames for videos from electrophysiology, n = 2255 1332 frames for videos from calcium imaging). Besides the position of each tracked point, 1333 DeepLabCut provides a value quantifying the certainty about the determined position (which 1334 is low in the case of occluded objects, e.g. the pupil during an eyeblink). Samples with a 1335 certainty < 0.5 were linearly interpolated from the last point before to the first point after the respective samples which had a certainty of > 0.5 (0.24/0.56 % of total pupil samples and 1336 1337 0.11/0.12 % of total eyelid samples acquired during electrophysiology and calcium imaging 1338 experiments, respectively). We then calculated the pupil diameter (as the maximum distance 1339 between two opposing points of the pupil) as well as its center of mass, and the opening of the 1340 eye (as the distance between the top and the bottom eyelid). Finally, blinks were removed from 1341 the eye-opening data by linearly interpolating regions which exceed the moving median minus 1342 three times moving median absolute deviation (sliding window = 30 s).
- 1343 Calcium imaging recordings. Using the expanded classification of the electrophysiology 1344 dataset, we extracted the following pupil/eyelid features: maximum and minimum pupil 1345 diameter, standard deviation of the pupil diameter, pupil area, pupil motion and eyelid distance. 1346 We then tested the extent to which it was possible to correctly predict the behavioral state on 1347 these features alone, similarly to Yüzgec et al., 2018. To this aim, we quantile transformed 1348 these features (quantiles=[50, 100, 500]), and passed them to a K-nearest neighbors classifier 1349 with similar hyper-parameters as the previous one (number of neighbors=[5, 101. weights=uniform, algorithm=auto, leaf size=1, p=2, scoring=f1 macro). Hyper-parameter 1350 1351 tuning was done using GridSearchCV. We then iteratively (n=100) tested the prediction 1352 accuracy on 25% of the dataset, yielding good average accuracy for wakefulness (~86%) and 1353 NREM sleep (~90%). On the contrary, most REM sleep was classified as NREM (~62%) and 1354 the accuracy for this category was significantly lower (~27%). Finally, we retrained the classifier

on the entire dataset of pupil/eyelid electrophysiological features, and used it to predict thebehavioral state of the calcium imaging dataset.

1357

### 1358 <u>Two-Photon Spine Image Processing</u>

1359 In each animal, at least one GFP-expressing CA1 pyramidal neuron was selected and 1-3 1360 dendrites of 20–50 µm length of each of the following types were analyzed: basal dendrites, 1361 oblique dendrites emerging from the apical trunk and tuft dendrites. Motion artefacts were 1362 corrected with a custom-modified Lucas-Kanade-based alignment algorithm written in Matlab. 1363 Spines that laterally emanated from the dendrite were counted by manually scrolling through 1364 the z-stacks of subsequent imaging time points of the same dendritic element, by an expert examiner blinded to the experimental condition. Protrusions from the dendrite that reached a 1365 threshold of 0.2 µm were scored as dendritic spines regardless of shape. If spine neck 1366 1367 positions differed 0.5 µm on the subsequent images, the spine was scored as a new spine. 1368 Spines were scored as lost if they fell below the threshold of 0.2 µm. Spine density was calculated as the number of spines per µm. The turnover ratio was calculated for every time 1369 1370 point by dividing the sum of gained and lost spines by the number of present spines. The survival fraction of spines was calculated as the percentage of remaining spines compared 1371 1372 with the first imaging time point.

1373 <u>Statistical analysis</u>

1374 Statistical analyses were performed using R Statistical Software (Foundation for Statistical 1375 Computing, Vienna, Austria) or GraphPad Prism. All R scripts and datasets are available on 1376 GitHub https://github.com/mchini/Calcium-Imaging---Anesthesia. Nested data were analyzed 1377 with linear mixed-effect models to account for the commonly ignored increased false positive 1378 rate inherent in nested design [111]. We used "mouse", "recording", "neuron" (calcium 1379 imaging), and "single unit" (electrophysiology) as random effects, according to the specific 1380 experimental design. Parameter estimation was done using the lmer function implemented in 1381 the *Ime4* R package [112]. Model selection was performed according to experimental design. 1382 Significance and summary tables for Imer model fits were evaluated with the ImerTest R 1383 package [113], using the Satterthwaite's degrees of freedom method. Post hoc analysis with 1384 Tukey multiple comparison correction was carried out using the *emmeans* R package.

1385

### 1386 Data Availability

1387 Further information and requests for resources and reagents should be directed to and will

- be fulfilled by the corresponding author, J. Simon Wiegert (simon.wiegert@zmnh.uni-
- 1389 hamburg.de).
- 1390 Data and Code Availability
- 1391 The code generated during this study is available at
- 1392 <u>https://github.com/OpatzLab/HanganuOpatzToolbox</u> and <u>https://github.com/mchini/Calcium-</u>
   1393 <u>Imaging---Anesthesia</u>
- 1394 The calcium imaging and electrophysiology data sets generated during this study are 1395 available at https://gin.g-node.org/SW lab/Anesthesia CA1
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