# Title: The locus coeruleus is a complex and differentiated neuromodulatory system

**Authors:** Nelson K. Totah<sup>1</sup>\*, Ricardo M. Neves<sup>1</sup>, Stefano Panzeri<sup>2</sup>, Nikos K. Logothetis<sup>1,3</sup>, Oxana Eschenko<sup>1</sup>\*

# Affiliations:

<sup>1</sup>Dept. of Physiology of Cognitive Processes, Max Planck Institute for Biological Cybernetics, Spemannstrasse 38, 72076, Tuebingen, Germany.

<sup>2</sup>Laboratory of Neural Computation, Istituto Italiano di Tecnologia, Corso Bettini 31, 38068, Rovereto, Italy.

<sup>3</sup>Div. Of Imaging Science and Biomedical Engineering, University of Manschester, M13 9PT Manchester, United Kingdom.

\*Correspondence to: Nelson K. Totah, <u>nelson.totah@tuebingen.mpg.de</u> or Oxana Eschenko, <u>oxana.eschenko@tuebingen.mpg.de</u>

**Summary:** Understanding the forebrain neuromodulation by the noradrenergic locus coeruleus (LC) is fundamental for cognitive and systems neuroscience. The diffuse projections of individual LC neurons and presumably their synchronous spiking have long been perceived as features of the global nature of noradrenergic neuromodulation. Yet, the commonly referenced "synchrony" underlying global neuromodulation, has never been assessed in a large population, nor has it been related to projection target specificity. Here, we recorded up to 52 single units simultaneously (3164 unit pairs in total) in rat LC and characterized projections by stimulating 15 forebrain sites. Spike count correlations were low and, surprisingly, only 13% of pairwise spike trains had synchronized spontaneous discharge. Notably, even noxious sensory stimulation did not activate the entire population, only evoking synchronized responses in ~16% of units on each trial. We also identified novel infra-slow (0.01-1 Hz) fluctuations of LC unit spiking that were asynchronous across the population. A minority, synchronized possibly by gap junctions, was biased toward restricted (non-global) forebrain projection patterns. Finally, we characterized two types of LC single units differing by waveform shape, propensity for synchronization, and interactions with cortex. These cell types formed finely-structured ensembles. Our findings suggest that the LC conveys a highly complex, differentiated, and potentially target-specific neuromodulatory signal.

# 1 Main Text:

2 In contrast to synaptic transmission-based interactions, neuromodulation has long been seen as "one-to-many" activity, with neuromodulatory nuclei often considered to be 3 undifferentiated "state-controllers". Example *par excellence* is the noradrenergic locus coeruleus 4 5 (LC), a diffusely projecting brainstem nucleus containing only approximately 1,600 neurons in the rat and 10,000 in humans (per hemisphere). The LC, as a part of the ascending reticular 6 activating system for arousal, is conserved across vertebrates, including teleosts (e.g. zebrafish), 7 amphibians, birds, and mammals, such as rodents and humans<sup>1,2</sup> (although neurochemical and 8 neurophysiological differences exist, for example, in cat LC in comparison to the highly similar 9 rodent and monkey LC<sup>3</sup>). The LC is thought to regulate broad networks related to a multitude of 10 functions, such as autonomic activity, endocrine function, nociception, sleep and arousal, 11 perception, attention, decision-making, learning, and memory <sup>4</sup>. Its neurons are considered to act 12 synchronously to non-specifically modulate the state of neuronal excitability in many forebrain 13 targets via simultaneous norepinephrine (NE) release <sup>2,3,5-7</sup>. The seemingly undifferentiated 14 activity of LC has influenced diverse theories ranging from neural control of sleep to 15 computational models of decision making <sup>5,8-10</sup>. 16

This perspective of global neuromodulation emerged primarily from two lines of research. The first one comprised anatomical and neurochemical studies demonstrating that the axons of individual LC neurons branch widely to innervate distant forebrain regions where their terminals release NE, which can spread up to ~100  $\mu$ m in the rodent cortex (volume transmission of NE also occurs in primate cortex although the spread in their larger brain is unknown)<sup>11-14</sup>. The second line included electrophysiological experiments showing that, in LC, multi-unit activity (MUA) is synchronized with changes in the local field potential (LFP, a marker of 24 transmembrane currents and other peri-synaptic activity within LC), that were registered synchronously with spatially segregated electrodes placed in the core of the nucleus <sup>2,15,16</sup>. 25 Uniform LC cellular activity is seen as the result of (i) shared synaptic input, (ii) gap junction 26 coupling, and (*iii*) intrinsic membrane potential oscillations at < 1Hz<sup>15,17,18</sup>. By firing together, 27 global NE release is thus achieved for the purposes of modulating communication across broad 28 forebrain circuits and for regulating global states of neuronal excitability <sup>4,7</sup>. In support of this 29 line of thinking, studies of another neuromodulatory system (i.e., dopamine), have also revealed 30 a similarly high degree of population synchrony, consistent with the notion that neuromodulatory 31 neurons broadcast a redundant reward-related, salience, and/or arousal signal 19-28. 32 Although recent anatomical studies have demonstrated that individual LC neurons could 33 provide localized forebrain neuromodulation by targeting different cortical sites<sup>29,30</sup>, 34 synchronous activity across LC neurons would still result in non-specific neuromodulation. 35 However, prior estimates of synchrony using LC MUA may not be accurate because single units, 36 which could spike independently, have been averaged over. Single unit recordings in LC, 37 though, are rare due to technical challenges. Specifically, the small size of the LC has permitted 38 mainly single wire recordings and the single unit waveforms of the densely packed LC cell 39 bodies are difficult to isolate using a single recording channel. At present, only one study in the 40 awake monkey and one study in the anesthetized rat have managed to simultaneously monitor 41 two single units, and the reported findings were based on small data sets, e.g. ~20 pairs of 42 neighboring single units recorded on the same electrode <sup>31,32</sup>. According to analysis of cross-43 correlograms, the spiking of approximately 80% of the unit pairs was synchronized on the 44 timescale of 100 – 200 msec, supporting to the notion of highly synchronized spiking among LC 45 46 neurons. Evidently, however, recording a small number of pairs (~20) with a single electrode

does not allow inferring the degree of synchronicity of a larger LC population. To address this question, we recorded up to 52 single units simultaneously (234 units and 3164 unit pairs in total) using a high-density recording array in urethane-anesthetized rats. In addition, we characterized projection patterns of individual LC units using forebrain electrical stimulation to evoke antidromic responses.

## 52 Identification and characterization of two distinct LC single unit types

We isolated 234 single units in 12 rats and recorded 5 to 52 individual LC units 53 simultaneously (Table 1). Single units exhibited typical electrophysiological and 54 pharmacological characteristics of LC NE-producing cells (Extended Data Figure 1). The 55 extracellular spike waveform shapes of LC single units separated into 2 types based on their 56 57 spike width and after-hyperpolarization amplitude (Figure 1A, B). We will refer to these populations as "narrow" and "wide" units. Out of 234 single units, 34 units were narrow (15%) 58 and 200 units were wide (85%). Interestingly, beyond distinct spike shape profile, these units had 59 60 a number of characteristic differences. Narrow units discharged at significantly higher rates 61 compared to wide units (Figure 1C, D; median and s.d.: 1.28±0.73 spikes/sec and 0.64±0.63 62 spikes/sec, respectively; Wilcoxon-Mann-Whitney, Z=4.23, p = 0.00002, Cohen's D = 0.823, 63 power = 0.973). The power to detect such an effect size at an alpha level of 0.05 was 97%. Both unit types were distributed throughout the dorsal-ventral extent of the LC, but narrow units were 64 relatively more predominant in the ventral aspect of the nucleus (Figure 1E). This distribution 65 66 was present in all 12 rats. Both narrow and wide units responded to foot shocks with excitation followed by local NE mediated auto-inhibition, which is typical of LC neurons and all units were 67 inhibited by clonidine, suggesting that both unit types were noradrenergic (Extended Data 68 69 Figure 1). Moreover, stimulation of forebrain sites elicited antidromic responses in 30% of

narrow units and a similar percentage (38%) of wide units (two-sided, Fisher's Exact Test, Odds
Ratio = 1.41, CI = [0.349 5.714], p=0.744), further suggesting that both unit types are likely
projection neurons.

# 73 LC single units have near-zero spontaneous and evoked spike count correlations

While the general consensus is that LC activity is "homogenous", "uniform" and "synchronous" <sup>2,3,6,15,16</sup>, the degree of synchrony has not been quantified from a large sample of LC neurons. Systematic large scale recordings in other brain regions have revealed that the degree of synchrony is region- and function-specific <sup>33</sup>. Knowing where LC falls on this continuum of synchrony would provide insight into the representations and computations of its neurons and the functional role of its output.

Although spike count correlations have been measured for cortical neurons <sup>34</sup>, they have 80 not been quantified in the LC. Earlier recordings, which were limited to a total of 23 LC 81 neuronal pairs, estimated 80% synchronous discharge by analyzing spike train cross-82 correlograms and detecting coincidental spiking over 100 - 200 msec epochs<sup>32</sup>. The best estimate 83 of LC synchrony, therefore, greatly exceeds the values obtained for cortical cell-pairs, of which 84 only 16% (32 out of 200 pairs) are reported to have a large central peak in the spike train cross-85 correlogram  $^{35}$ . This yields a correlation coefficients of ~0.05 to 0.1 in cortex  $^{34}$ . (Note that, when 86 87 a spike train cross-correlogram is integrated over sufficiently large lags, the integral approximates the spike count correlation coefficient  $^{36}$ ). Thus, given the 80% population 88 89 synchrony that has been reported among LC spike trains, one might expect relatively LC correlation coefficients and the proportion of significant correlations to greatly exceed those in 90 91 cortex (0.1 and 16%, respectively). In order to establish a quantitative measure of correlated 92 firing in LC, we calculated the spike count correlation coefficient for 3164 LC single unit pairs.

93 We analyzed spike counts in bins of 200 msec and 1 sec, which were each chosen based, respectively, on the 100-200 msec duration of coincidental spiking reported in LC cross-94 correlograms <sup>32</sup> and the previously demonstrated relationship between rhythmic increases of LC 95 multi-unit firing in relation to cortical 1 - 2 Hz slow waves <sup>37,38</sup>. The correlation coefficients were 96 distributed around zero (Figure 2). The mean correlation coefficient across all 3164 pairs of 97 recorded units was 0.044±0.001 for 200 msec bins and 0.098±0.003 for 1 sec bins. Pairwise 98 correlated variability did not depend on a distance between the units (Extended Data Figure 99 **2A**). One factor to consider is that higher values of correlations are generally reported under 100 101 various types of anesthesia and this has been shown to be largely due to the fact that, under anesthesia, neurons are more locked to slow network activity and/or neuronal population 102 oscillations <sup>39-43</sup>. To ease this concern, we developed a non-parametric permutation test of 103 104 significance of correlations that discounts the spurious correlations due to non-random interspike intervals and common locking to slow oscillations that may arise because of anesthesia. 105 Only 16% of pairs had synchronous spiking that was significantly higher than what would be 106 107 expected to occur by chance (one-sided permutation test, p < 0.01, see Materials and Methods). This suggests that synchrony between LC cells, though present, is much weaker and sparser than 108 expected from previous reports <sup>32</sup>. Given that correlations tend to be larger when firing rate is 109 higher firing <sup>44</sup>, one possible concern is that within-LC correlations may be sparser and weaker in 110 anesthetized animals, compared to the awake animal, simply because LC firing rates are slightly 111 lower under anesthesia. To address this concern, we separately analyzed unit pairs with a 112 geometric mean rate that was similar to the rate observed in awake rats and non-human primates 113 (greater than 1 Hz,  $^{2,45-50}$ ). We found that 19.2% of these higher rate pairs (N = 506) had 114 115 significantly positive correlation coefficients (one-sided permutation test, p < 0.01), which was

similar to the percentage (15.8%) of lower rate pairs (N = 2658). Thus, our results show that correlated spiking is not predominant between pairs of LC neurons, even when firing rate is quantitatively similar to those observed in the awake state. The values of correlation coefficients suggest that spontaneous LC population activity may not be described as a purely synchronous pool that broadcasts a homogenous signal.

Sensory stimuli evoke burst spiking of LC neurons, which is thought to be a robust, 121 homogenous population response to each stimulus <sup>16</sup>. In order to study correlations between 122 evoked LC spiking activity, we applied a single foot shock (5.0 mA, 0.5 msec pulse duration) 123 124 and measured spike count correlations during the time window of the maximal evoked discharge (50 msec after stimulation). The mean evoked spike count correlation was distributed around 125 zero (Figure 2). Increasing the stimulus intensity to 5 pulses (at 30 Hz) did not increase 126 synchrony (single pulse: 0.007±0.006 versus 30 Hz: 0.012±0.006, Wilcoxon-Mann-Whitney, 127 Z=1.24, p=0.214). Moreover, accounting for possible adaptation by calculating correlations in 128 blocks of 5 trials (e.g., trials 1-5, 6-10, and so on) did not demonstrate any propensity for 129 130 higher correlations during earlier stimulation trials for either stimulation intensity (single pulse: Kruskal-Wallis H = 0.68, p = 0.711; 30 Hz: Kruskal-Wallis H = 0.69, p = 0.709). Thus, the low 131 trial-by-trial evoked spike count correlations suggest that individual units respond independently 132 from each other on every trial. Indeed, within 50 msec after a foot shock a robust population 133 response is easily observed, yet on average only 16% of units responded on each trial of a single 134 foot shock (Figure 3). The proportion of neurons responding to the stimulus in each trial 135 remained relatively low when the post-stimulus window was increased to 100 msec (20% of 136 units) or 200 msec (28% of units). This finding strongly contrasts the prevailing view that many 137 138 LC neurons respond - in unison - to sensory stimuli in a phasic population burst.

139 Although the recorded population of LC units exhibited overall weak correlations, we further examined spike count correlations between pairs of narrow or wide units, as well as 140 between unit types. Correlations among each type of pair were similar for spontaneous spiking 141 (Welch's F(2.253.81)=1.42, p=0.245,  $\omega^2 = 0.0003$ ). Evoked correlations may differ by unit pair 142 type (but the Kruskal-Wallis test was under-powered, H=7.64, p=0.022,  $\omega^2 = 0.0003$ , power = 143 0.175). Post-hoc tests suggest that pairs of mixed unit type may have a more negative median 144 correlation than pairs of wide type units (p=0.017). Nevertheless, the mean correlation values 145 were near zero for all pair types, which suggests that neither type of LC unit formed a highly 146 147 correlated sub-population with other units of the same or different type. Strikingly, a large number of negative spike count correlations emerged during evoked 148 activity. Furthermore, negatively correlated pairs were observed only when the pair included a 149 150 wide unit (Figure 2, arrows). Negative spike count correlations, specifically after sensory stimuli, may reflect lateral inhibition, which is generated by somatic release of NE that inhibits 151 neighboring neurons via alpha-2 adrenoreceptors <sup>51-53</sup>. Somatic release requires the high 152 frequency of spiking typically associated with sensory stimuli and not spontaneous activity <sup>54</sup>. 153 Given that both unit types were responsive to salient stimuli, our results suggest that only the 154 stimulus-evoked discharge of wide units generates sufficient somatic NE release to cause local 155 lateral inhibition, but both unit types are noradrenergic and susceptible to lateral inhibition. 156

157

# Synchrony due to putative gap junctions or common synaptic input is rare

The presence of a minority of pairs with highly positive spike count correlations suggests that at least some LC single units are correlated. Their synchronized activity could be due to synaptic drive shared by a neuronal pair or electrotonic coupling between the pair <sup>55-59</sup>, which are both prevalent forms of connectivity in the LC. We assessed the duration of coincidental spiking 162 between unit pairs by measuring cross-correlograms between spike trains. All cross-correlogram analyses used spontaneous spiking. We chose to study coincident spiking on two timescales, tens 163 of milliseconds ("broad-type" interactions) or sub-millisecond ("sharp-type" interaction) that 164 could reflect either common synaptic input or gap junctions, respectively. Shared synaptic input 165 from a third neuron (or group of neurons) appears, instead, as a zero-centered peak which is 166 broad (spread over tens of milliseconds)<sup>57</sup>. Gap junctions are associated with a sharp peak that is 167 shifted 0.5 to 1 millisecond from zero 58-60. We observed coincident spiking on both timescales 168 (Figure 4A). Cross-correlograms were assessed against a spike time-jittered surrogate (grey and 169 170 blue lines, Figure 4A).

We found that only 13% of unit pairs had significant cross-correlations (Figure 4B). Of 171 those 13% of correlated unit pairs, 60% had broad-type interactions, while 13% had sharp-type 172 173 interactions, and the remaining 27% had both broad- and sharp-type interactions. Thus, only 11% of all 6,299 recorded pairs (interactions considered in both directions) spiked within tens of 174 milliseconds, which is remarkably low, given an estimate of 80% of LC pairs spiking 175 synchronously at this timescale based on prior evidence from 23 pairs <sup>31,32</sup>. The proportion of 176 synchronized LC neurons is similar to the proportion of synchronized cortical neurons reported 177 as 3.6%, 13%, and 56% under various conditions 55,61,62. 178

A significantly larger proportion of narrow unit pairs had significant broad-type interactions in comparison to pairs of wide units and pairs of mixed unit types (**Figure 4B**). This finding is consistent, in general, with more positive spike count correlations between narrow units (**Figure 2**). Furthermore, pairs with broad-type interactions had higher spike count correlations in comparison to pairs with sharp-type interactions and pairs without significant (**Extended Data Figure 3**). These results are consistent with broad-type

185 interactions and spike count correlations both reflecting common synaptic input. Broad-type interactions, just like spike count correlations, did not depend on the distance between the unit 186 pairs and therefore occurred with similar frequency throughout the LC nucleus (Figure 4C). The 187 distance-invariance of correlated activity in LC (Extended Data Figure 2, Figure 4C) concurs 188 with anatomical evidence of many LC neurons integrating broad and non-topographically 189 organized afferent inputs to the nucleus <sup>63</sup>. Our findings of little correlated activity suggest the 190 potentially synchronizing influence of shared synaptic input from a broad set of afferents is 191 somehow limited. 192

We next assessed the dynamics of broad-type interactions by examining the peak times of 193 the cross-correlograms for pairs with significant interactions. In the example cross-correlograms 194 (Figure 4A), there is a notable diversity in the timing of the interaction in different pairs. The 195 interaction in **Figure 4A1** was centered at 0 msec, while interactions between other pairs 196 occurred before 0 msec (Figure 4A2) or after 0 msec (Figure 4A3). Across the population of all 197 pairs with significant broad-type interactions, the cross-correlogram peak times were spread over 198 199  $\pm 70$  msec (Figure 4D). The peak should be centered at 0 msec if common synaptic input jointly drives the pair <sup>57</sup>. Therefore, neuronal interactions in LC at this timescale may reflect common 200 synaptic input interacting with other mechanisms that introduce a delay. For example, lateral 201 inhibition <sup>51,53</sup> between units sharing a synaptic input could delay their correlated synaptic 202 responses. The local NE release due to discharge of single LC neuron (or a small number of 203 neurons) inhibits spiking of neighboring LC neurons for  $\sim 100$  msec<sup>53</sup>. The duration of lateral 204 inhibition demonstrated in this prior work corresponds with the delays observed here for broad-205 type interactions (Figure 4D), suggesting that lateral inhibition may be responsible for correlated 206 207 spiking with a delay.

208	In addition to brief (sub-millisecond to tens of milliseconds) interactions, synchrony
209	could conceivably occur over multiple seconds or even minutes to hours, given that LC spiking
210	is related to arousal <sup>2</sup> . We used a data-driven approach to potentially detect synchrony occurring
211	in long windows ranging from 20 milliseconds to 40 seconds <sup>36</sup> . Based on this analysis, we
212	examined cross-correlograms over a ±20 sec window (against a surrogate of jittered spikes).
213	However, out of the already limited set of synchronous pairs observed, the vast majority of
214	synchronous spiking occurred in a window of 70 msec (Extended Data Figure 4). Thus, the
215	time windows we have explored throughout these analyses are sensitive to the timescale of
216	synchrony in the LC.

#### 217 Sharp-type interactions are spatially localized

Out of the 13% of cross-correlograms that were significant, 40% were sharp-type 218 interactions, which is 5% of all recorded pairs. These sub-millisecond interactions between LC 219 units fell off rapidly with the distance between units, which may suggest a dependence on 220 221 electrotonic coupling (Figure 4C). A predominant view of LC function is that gap junctions spread synchrony throughout the LC using collections of electrotonically-coupled neurons <sup>5,17,32</sup>. 222 Considering the possibility that sharp-type interactions may reflect gap junction coupling (as 223 others do for cross-correlograms of spike trains recorded in the retina, cortex, and cerebellum, <sup>58-</sup> 224 <sup>60</sup>), we counted the number of units which exhibited sharp-type interactions with one or more 225 226 other units. Out of the units with at least one sharp-type interaction with another unit, 38% 227 interacted with only this one other unit (i.e., a network of 2 units), 35% interacted with 2 other units, 16% interacted with 3 other units, and the remaining 11% interacted with 4 to 6 other 228 units. These findings suggest that synchrony on the timescale of putative gap junctions is 229 primarily limited to networks of 2 to 3 units, but also as many as 7 units. 230

231 We assessed the propensity of these networks to produce repeating patterns of spiking over a few milliseconds, which could be mediated by putative gap junctions (such that some of 232 unit A's spikes would be consistently followed by unit B spiking around 1 msec later, followed 233 by unit C spiking around 1 msec after that). Repeating patterns occurred with negligible 234 frequency. In 2 out of 12 rats, we observed triplets of units that spiked in a consistent order over 235 4 msec (allowing for 0.4 msec jitter of each spike). Only 1 triplet out of 22,100 possible triplet 236 patterns (0.005%) was found in one rat and 4 triplets out of 1,330 possible triplet patterns 237 (0.301%) were found in the other rat. Patterns beyond triplets were never observed. Sharp-type 238 interactions (possibly reflecting electrotonic coupling) are, therefore, spatially limited. 239

# 240 Spiking of individual LC units oscillates asynchronously at low (< 2 Hz) frequencies

Synchronized rhythmic spiking of LC units could emerge from entrainment with cortical oscillations. In the cortex, these oscillations are prominent during slow wave sleep and anesthesia (but also during the awake state) and include a 1 - 2 Hz "delta oscillation" regime and <1 Hz "infra-slow oscillation" regime <sup>64-70</sup>. LC MUA has been shown to oscillate in these frequency bands and phase lock to the cortical oscillation leading to the impression that the majority of LC neurons spike together, entrained with the cortical oscillation <sup>37,38,71</sup>.

We first characterized oscillations in the firing rate of LC single units by calculating the power spectrum of each unit's spike train converted into a continuous spike density function (SDF, convolution with a 250 msec Gaussian kernel). We calculated the power spectrum of each single unit SDF and then examined the average power spectrum across all 234 single units (**Figure 5A**). We observed peaks in the infra-slow frequency band. These peaks reflect rhythmic fluctuations in spike rate that are predominant in many single units, but not necessarily synchronous across units. Surprisingly, in contrast to the infra-slow band, we did not observe any

254 distinct peak in the delta oscillation frequency band. This result is unexpected in light of previous studies, which have found that LC multi-unit spike rate oscillated in this range <sup>37,38,71</sup>. In order to 255 understand the relationship between the activity of LC single units and cortical delta oscillations, 256 we first compared our results with prior studies of LC multi-unit spike rate by merging all 257 simultaneously recorded spike trains into a single multi-unit spike train and converting that to a 258 SDF (250 msec Gaussian kernel). In line with previous studies, we observed that LC multi-unit 259 spike rate did oscillate in the delta frequency band (Figure 5B). Out of 8 rats with spiking during 260 cortical delta oscillations, all 8 of the multi-unit signals were significantly phase locked 261 262 (Rayleigh's Z test, p < 0.05) to the cortical LFP delta oscillations (**Figure 5C**). Our results demonstrate that if only multi-unit spiking is measured (as is typical in LC recordings), the data 263 suggest that LC neurons respond synchronously along with cortical oscillations; however, our 264 data reveal that this is not the case at the single unit level. In spite of LC single units not 265 exhibiting spike rate fluctuations at ~ 1 - 2 Hz (Figure 5A), approximately 69% of single units 266 were significantly phase locked to the cortical delta (Rayleigh's Test for Circular Uniformity, 267 p<0.05). Individual LC neurons, therefore, respond during periodic (1 - 2 Hz) transitions to states 268 of heightened cortical excitability, but each on different cycles rather than as a synchronized, 269 rhythmically fluctuating population which yields no 1 - 2 Hz peak in the single unit power 270 271 spectrum.

Similar proportions of each unit type (70% of wide units and 66% of narrow units) were
phase locked (two-sided Fisher's Exact Test, Odds Ratio=1.23, CI=[0.470 3.202], p=0.803).
Notably, narrow units responded significantly earlier in the cortical delta oscillation (WatsonWilliams test for equal circular means, F(83)=40.959, p<0.0001; Figure 5D). Narrow units</li>
responded during the LFP delta oscillation trough to peak transition, while wide units responded

277	closer to the LFP peak; thus, in contrast to the canonical thinking that LC neurons act
278	homogenously to precipitate up states, we show that each unit type may make differing
279	contributions to neuromodulation of cortical excitability <sup>7,37,38</sup> .
280	Intriguingly, we observed strong single unit spike rate oscillations in the infra-slow
281	frequency band (Figure 5A), specifically at 0.09 Hz (periods of 11 sec) and $0.4 - 0.5$ Hz
282	(periods of around 2 sec), which were readily observable in SDF's (Figure 5G, top panel).
283	Additional examples for the 0.09 Hz oscillations are presented in <b>Extended Data Figure 5</b> . Both
284	unit types oscillated at these frequencies and narrow units also oscillated at additional
285	frequencies between 0.1 and 0.2 Hz (Figure 5E). The infra-slow oscillations were coherent
286	between pairs of units (Figure 5F). Strong coherence between unit pairs suggests that
287	synchronous spiking of LC unit pairs may occur at infra-slow oscillatory time scales. Therefore,
288	we next examined the phase relationship of the spike rate oscillations between LC units in the
289	infra-slow range. Spiking of the majority of pairs (73% for 0.4 - 0.5 Hz and 67% for 0.09 Hz)
290	oscillated coherently with a stable phase relationship (Rayleigh's Test for Circular Uniformity,
291	p<0.05). The three examples exhibited stable phase relationships, with one pair's spiking
292	fluctuating synchronously (in-phase at nearly 0 degrees phase difference), whereas other pairs
293	responded in a stable anti-phase pattern (180 degrees phase difference) such that their spiking
294	was consistently in opposition (asynchronous) over infra-slow time scales (Figure 5G, bottom
295	panel). At the population level (all 3,164 pairs), the mean phase relations across all pairs were
296	distributed uniformly for spike rate oscillations at both 0.09 Hz (Rayleigh's Z=2.531, p=0.080)
297	and $0.4 - 0.5$ Hz (Rayleigh's Z=1.074, p=0.342). These data indicate that most pairs exhibit
298	coherent oscillations, but only a small portion oscillate synchronously (in-phase), yielding little
299	oscillatory synchrony at the whole population level.

#### 300 LC single units exhibit complex population patterns and form ensembles

Although we have found multiple lines of evidence that LC single units do not respond 301 synchronously, it is in principle possible that the LC contains smaller groups of units with 302 synchronized activity, that is, cell ensembles. For example, we observed a minority of highly 303 304 correlated unit pairs (long right tails in the spike count correlation coefficient distributions in Figure 2 and 13% of pairwise cross-correlograms were significant in Figure 4). To explore this 305 further, we measured the coupling of single unit spiking to the spiking of the population (all 306 remaining units) with 1 msec resolution. Population coupling measures the number of spikes that 307 occur in the population in the same msec as a single unit spike <sup>72</sup>. During spontaneous activity, 308 population coupling varied across individual single units. For example, the spiking of example 309 310 Unit A was highly synchronous with other units in the population (Z-score at time 0 is  $\sim 13$ ), whereas example Unit B was uncoupled (Z < 2 at time 0) from the population (Figure 6A). The 311 312 distribution of Z-scores at 0 msec across all single units indicated the presence of both uncoupled single units (34% of units had Z < 2) and population coupled units (**Figure 6B**). Population 313 coupling suggests that some sub-sets of multiple units may be synchronously active as 314 ensembles. The one millisecond timescale of population coupling suggests that ensembles may 315 be active on extremely brief scales. 316

Sensory stimulation is thought to evoke synchronous discharge of many LC neurons <sup>16</sup> and should therefore result in strong population coupling for most single units. Astonishingly, foot shocks did not cause coupling of a large number of single units to the population (**Figure 6C, D**), suggesting a lack of synchronous population discharge to sensory stimuli at a msec time scale, in line with our earlier pairwise analysis (**Figure 2B, 2C, Figure 3**).

322 We next attempted to detect and discriminate which LC units formed correlated subpopulations spiking together as ensembles using graph theory analysis. We observed ensembles 323 in each set of simultaneously recorded units (Figure 6E). We identified a total of 23 ensembles, 324 ranging from 1 to 3 per rat, and consisting of 2 to 9 units per ensemble. Ensembles were most 325 likely due to distance-invariant shared synaptic inputs (Extended Data Figure 2, Figure 4C), 326 which contributed the majority of correlated activity in the nucleus; correspondingly, LC unit 327 ensembles were spatially diffuse (Extended Data Figure 6). Surprisingly, the units in an 328 ensemble often consisted of the same unit type (Figure 6F). 329

## 330 A minority of correlated single units provide targeted forebrain neuromodulation

We examined the degree to which correlated units have overlapping projection targets. 331 332 We assessed the projection properties of LC cells by applying direct electrical stimulation in up to 15 forebrain sites. Example spike rasters showing antidromic responses, latencies to respond, 333 number of projection targets, and firing rates of units based on projection target are shown in 334 335 (Extended Data Figure 7). The mean latencies for each projection target are consistent with the prior literature <sup>73-75</sup>. In general, positively or negatively correlated unit pairs (those with 336 337 significant correlation at p < 0.01, permutation test) did not have any greater tendency for both 338 units to jointly project to overlapping forebrain targets (Figure 7A, B). Additionally, pairs with 339 broad-type interactions (assessed by spike train cross-correlograms) did not relate to the degree 340 of target overlap between units (**Figure 7C**). However, pairs with sharp-type interactions were 341 more likely to project to the same target (**Figure 7D**). Significantly more pairs with sharp-type interactions (88%) than non-interacting cell pairs (72%) had overlapping projections to the same 342 forebrain zone (Cohen's D = 0.55, one-sided Fisher's Exact Test, p=0.075). Out of the unit pairs 343 with overlapping projection zones (e.g., any division of prefrontal cortex or sensory cortex or 344

thalamus), cell pairs had a similar tendency to project to cortex more than thalamus and

346 prefrontal cortex over sensory cortex (**Figure 7D**, inset).

347

- 348 Discussion
- 349

## 350 The LC contains multiple, functionally differentiated cell types

We observed two types of LC units that differed by waveform shape, firing rate, 351 propensity for synchronization, and interactions with cortex. The cell types also had remarkably 352 353 different dorsal-ventral distributions within the LC. Our findings provide at least three lines of evidence that these cell populations may have different functions. First, we found that each cell 354 type has unique local circuit properties, namely narrow and wide units have differing capabilities 355 to cause local NE-mediated lateral inhibition and oscillatory firing rate changes (spike-spike 356 coherence) at different frequencies. Second, we revealed that each cell type tended to form 357 ensembles with other cells of the same type. Third, we observed differential phase locking to 358 cortical oscillations, which may imply distinct roles in modulating cortical excitability. This 359 latter finding suggests that the activity of LC narrow units (which were locked to an earlier phase 360 of cortical LFP delta oscillations and had a higher firing rate that should release more NE) could 361 function as a cell type-specific mechanism for regulating cortical excitability in a more selective 362 manner than is commonly attributed to neuromodulatory systems<sup>7</sup>. Although anesthesia also 363 alters cortical LFP<sup>76,77</sup>, delta oscillations appear very similar in the awake, sleeping, and 364 anesthetized rodent <sup>64-66</sup>. Further investigation of the relationship between cortical LFP and LC 365 cell types during natural states of wakefulness and sleep is warranted now that these LC cell 366 367 types have been described.

368	The significance of multiple LC cell types remains to be seen. Although their
369	morphological, genetic, and membrane electrophysiology characteristics cannot be resolved with
370	extracellular recordings, our work reveals a new level of diversity among LC single units. This
371	diversity introduces many outstanding questions from the local circuit and afferent
372	connectivity principles that underlie formation of LC cell type-specific ensembles to how LC
373	ensemble activity patterns modulate forebrain targets. Recent work suggests that separate LC
374	ensembles may modulate distinct forebrain targets to control different behaviors <sup>78</sup> .
375	
376	Population synchrony occurs among a small proportion of LC neurons
377	Correlations have been consistently reported between neuronal pairs within many brain
378	structures and are thought to be a defining feature of neural population activity. The strength of
379	correlation varies across brain regions and may have profound influences on the time scales of
380	the computations that neuronal ensembles perform and the functional relevance of their output $^{33}$ .
381	The most prominent hypothesis is that the LC <sup>2,3,5,6,22</sup> and, in general, other neuromodulatory
382	nuclei <sup>28</sup> may be at the higher end of correlation strength.
383	We detected synchronous activity among only 16% of cell pairs (~ 3000) and observed
384	spike count correlation coefficients that were, on average, 0.04. Furthermore, strong noxious
385	stimulation (electric foot shock) was expected to evoke a synchronized response of the entire LC
386	population, but we instead observed that a relatively small proportion (~16%) of units
387	contributed to the population response on each trial. Correlations decrease with lower firing rates
388	<sup>44</sup> and urethane anesthesia is known to reduce spike rate by weakly effecting synaptic and non-
389	synaptic currents <sup>40,65,79-81</sup> . We report spike rates (mean 0.89 Hz), which were not far below

390 what occurs during the awake state (reported means range from 0.92 Hz to 1.4 Hz in the rat and

monkey<sup>2,45-50</sup>). Moreover, when we considered correlations among only pairs with firing rates 391 over 1 Hz, the proportion of correlated pairs remained similarly small (19.2%). Even more 392 strikingly, similar levels of correlation were obtained for spontaneous and evoked firing (with the 393 latter eliciting much higher spike rates), which further strengthens the view that LC synchrony 394 may be much lower than previously assumed. Regardless of the anesthesia effects on the firing 395 rate, many studies across many types of anesthetics, brain regions, and species have suggested 396 that anesthesia actually increases spike count correlation coefficients by effecting large scale 397 fluctuations of population activity <sup>39-42</sup>. Thus, our finding of such low synchrony under 398 anesthesia is unexpected. Building upon our findings, future work should test the hypothesis that, 399 in the awake state and without the strong network fluctuations associated with urethane 400 anesthesia or slow wave sleep, LC synchrony is further reduced. 401

The presumption about a robust LC synchrony originated from an earlier study, which 402 estimated that the activity of 80% of LC cell pairs was synchronized over ~100 milliseconds; yet 403 this estimation was based on a relatively small number (~20) of pairs recorded in the awake 404 monkey <sup>32</sup>. We also report that correlated activity was primarily focused in the timescale of less 405 than 100 milliseconds based on spike train cross-correlograms assessed over a large range from 406 0.5 milliseconds to 40 seconds. Critically, however, the proportion of the population that was 407 synchronized (16%) was much lower than the previous report (80%) when a larger population 408 (>3000 pairs) was studied. Correlation strength is known to vary across brain regions and 409 knowledge of the correlation structure in the LC lays the groundwork for understanding better 410 the representations and computations of LC neurons and the functional role of noradrenergic 411 neuromodulation by LC ensembles. 412

#### 414 *Gap junctions as a mechanism underlying LC ensemble activity*

Prior accounts have emphasized gap junctions as the source of synchrony in LC <sup>5,17,32</sup>: 415 however, we found little evidence to support this assumption. Numerous studies, which have 416 inactivated gap junctions, conclusively demonstrate that the brief (0.5 to 1 millisecond) cross-417 correlogram peaks reflect gap junction coupling 58-60. In our data, we observed this sharp sub-418 millisecond cross-correlogram profile that may reflect putative gap junctions between LC 419 neurons. However, the lack of sub-millisecond interactions beyond two neurons, as well as the 420 rapid decay of sharp type interactions with distance each suggests that gap junctions are not 421 422 likely to spread synchrony throughout the LC. It is unlikely that anesthesia interfered with observations of gap junction interactions. Although synchrony due to longer duration synaptic 423 events (e.g., drive by common synaptic input to a cell pair) could be missed when spike counts 424 are reduced under anesthesia (but see <sup>39-42</sup>), synchrony due to brief events (e.g., driven by gap 425 junctions) should not be affected by anesthesia-induced spike count suppression. 426 Intriguingly, it is possible that the gap junctions in the LC actually contribute to 427

population desynchronization and the existence of simultaneously active LC ensembles. Systems 428 that are coupled through gap junctions are certainly predisposed to exhibit synchronous changes 429 of both membrane potential and spike probability <sup>82</sup>. Recordings of the relatively deafferenated 430 LC in slice (*in vitro*) recordings have demonstrated exactly such gap junction-synchronized 431 membrane potentials <sup>17</sup>. However, when whole-brain afferent input is present (as in our 432 experiments) and the neurons have action potentials with a large amplitude after-433 hyperpolarization (as is the case for LC neurons <sup>30</sup>), an excitatory afferent input can phase shift 434 the relation between neurons' membrane potentials, which results in both desynchronization at 435 the population level as well as only sub-sets of neurons (ensembles) that are synchronized  $^{82}$ . 436

Thus, our results do not support the view that gap junctions enable massive population

438 synchrony in LC, but do not exclude their contribution to synchronize activity within distinct cell439 ensembles.

440

#### 441 *Common synaptic inputs and local lateral inhibition may interact to promote LC synchrony*

In addition to the sub-millisecond cross-correlogram peaks, we also observed cross-442 correlogram peaks over tens of milliseconds. These interactions over longer time scales may 443 reflect a cell pair interaction with a third neuron (or group of neurons) that provides shared 444 synaptic input to the pair. Intriguingly, we observed that these longer duration interactions were 445 temporally diverse, spanning a range from 10 to 70 msec and lasting variable durations. While 446 anesthesia could have caused under-sampling of the overall number of unit pairs synchronized 447 by long duration synaptic events like common synaptic input, the existence of this temporal 448 diversity of pairwise interactions is unlikely to be affected by anesthesia. 449

We propose that this delayed synchrony is due to a combination of shared synaptic inputs 450 and lateral inhibition. A comparable time delay (±70 msec) has been previously reported in spike 451 train cross-correlograms from paired intracellular slice recordings <sup>17</sup>. In that work, the delayed 452 cross-correlogram peaks did not occur when local LC activity was prevented, which is a 453 manipulation that would remove local lateral inhibition. Moreover, the duration of lateral 454 inhibition corresponds to this  $\pm 70$  msec delay <sup>53</sup>. Thus, our findings suggest the possibility that 455 synchrony in the LC depends on the cooperation of shared synaptic inputs (extra-LC) and lateral 456 inhibition (intra-LC). Wide type LC cells may be a crucial controller of LC synchrony given our 457 findings that the wide type units may be the source of lateral inhibition. 458

459

#### 460 The mechanisms underlying the desynchronized population response to sensory stimuli

Our observations provide the first experimental evidence that LC single units do not 461 spike synchronously in response to a noxious somatosensory input (foot shock). This result is 462 surprising given that noxious sensory stimuli generate strong synaptic input across LC neurons, 463 which is expected to drive correlated spiking among them. Noxious somatosensory stimuli are 464 conveyed by both direct afferents from the dorsal horn neurons in the spinal cord (peripheral 465 nociception) and the brainstem sensory trigeminal nuclei (peripheral nociception from the head) 466 <sup>83</sup>, as well as indirect (di-synaptic) nociceptive input from the rostral medulla<sup>84</sup>. In both cases, 467 single afferents synapse onto many LC neurons. We speculate that the desynchronized response 468 to sensory stimulation may depend on each cell's pre-stimulus membrane potential, which may 469 be in a different state prior to each sensory stimulus. We propose that this could occur given that 470 LC neurons receive a diverse mixture of excitatory and inhibitory afferents from many brain 471 regions – inputs that may be asynchronous (and/or opposing in excitatory/inhibitory valence) 472 with respect to each other <sup>63,84,85</sup>. Furthermore, refractory periods, self-inhibition, and lateral 473 474 inhibition could set LC neurons to a dynamic mixture of membrane potentials. Thus, LC neurons that are in a higher state of excitability may spike and then inhibit other LC neurons from 475 responding to the foot shock through lateral inhibition 51,53,86. 476

It is unlikely that sensory stimuli in other modalities, which only elicit a LC response in the awake state (e.g., non-noxious auditory, visual, and somatosensory stimuli <sup>49</sup>), would evoke greater synchronous spiking than foot shocks do under anesthesia. Somatosensory stimulation that is milder than the noxious foot shocks we used here is not likely to evoke more robust LC responses in awake state. It is possible that stimulation that is close to the physiological limit may increase the probability of a synchronized population response <sup>87</sup>. Visual and auditory

stimuli evoke synaptic responses in the LC via a longer poly-synaptic pathway <sup>88-90</sup>. The 483 synaptic delays and the noise added by synaptic transmission at each step are expected to jitter 484 the timing of common synaptic input to LC cell pairs and, thus, reduce synchronized spiking. 485 These questions should be resolved by recording large numbers of single units from the awake 486 animals. 487

- 488
- 489

# Potential for targeted neuromodulation by LC ensembles

Contrary to the current view of the LC as a non-specific neuromodulatory system, our 490 491 data suggest that targeted forebrain neuromodulation could possibly be achieved by selective activation of gap junction coupled LC cell assemblies that share common efferent targets. We 492 showed that unit pairs with synchronous activity on the sub-millisecond timescale were more 493 likely to project to similar forebrain regions. We also observed a tendency for anti-correlated 494 units, which spike in opposition with one another, to avoid projecting to the same forebrain 495 areas. These data are consistent with targeted neuromodulation under a scenario in which one 496 population of units projects heavily to the forebrain Region A, while another population avoids 497 Region A and projects heavily to Region B. During times when the A-projecting population is 498 active, NE content in Region A increases while the B-projecting population is suppressed and 499 NE content in Region B decreases. 500

Targeted forebrain neuromodulation may also be achieved by NE gradients between 501 502 forebrain sites, which could be generated by infra-slow (<1 Hz) oscillations in spike rate. Our results demonstrate that LC neurons will have in-phase spike rate oscillations within their group 503 and anti-phase spike rate oscillations with neurons outside their group. Thus, over an infra-slow 504 505 duration (2 to 10 sec), some LC neurons will synchronously release NE to their projection

targets, while other LC neurons are suppressed. Depending on their projection targets (which can
often be single forebrain regions according to our data and others <sup>29</sup>), NE could be
simultaneously high in some forebrain regions and simultaneously low in others over a timescale
of 2 to 10 sec.

We also speculate that these infra-slow changes in LC spike rate could orchestrate infra-510 slow LFP, EEG, or BOLD oscillations in multiple cortical regions and promote communication 511 among these regions by synchronizing their infra-slow oscillations in order to organize 512 functional (or resting state) networks <sup>67-70,91,92</sup>. LC spiking (and associated NE release) regulates 513 cortical excitability; coherent infra-slow oscillations of LC spike rate among sub-sets of LC 514 neurons may therefore allow different LC ensembles to influence synchronization among the 515 regions in separate cortical networks. Our data thus provide experimental support for a 516 theoretically predicted, but speculative function of the LC to organize task-related and resting 517 state networks <sup>67,93,94</sup>. Given that different LC cell types spiked coherently at different infra-slow 518 frequencies, it is possible that narrow and wide cell types participate differentially in resetting 519 cortical networks. Additionally, vascular innervation by LC neurons may directly affect the 520 hemodynamic response and alter the physiology underlying the generation of the fMRI BOLD 521 signal used to study cortical networks. The physiology of the BOLD signal, which is a common 522 research and diagnostic tool, may be better understood when future studies establish how LC 523 neurons – and especially the different LC cell types reported here – modulate cortical network-524 specific neurovascular coupling. 525

Lastly, our findings do not contradict the long-standing notion of global NE
 neuromodulation. Volume NE release may provide simultaneous post-synaptic

neurotransmission in distant brain regions on a time scale of a few seconds <sup>11,95</sup>. This global and

529	relatively slow neuromodulation is clearly synchronous by nature and presents a critical
530	component of controlling brain state and neuronal excitability, especially on behaviorally
531	relevant timescales (seconds, minutes, or hours). In addition to its role in global
532	neuromodulation, the LC system appears to be anatomically and functionally differentiated with
533	diverse cell types and finely-structured activity patterns. These features may allow a more
534	nuanced role for the LC in theories of systems and cognitive neuroscience.
535	
536	Methods
537	Animals
538	Twelve male Sprague-Dawley rats (350 - 450 g) were used. All experimental procedures
539	were carried out with approval from the local authorities and in compliance with the German
540	Law for the Protection of Animals in experimental research (Tierschutzversuchstierverordnung)
541	and the European Community Guidelines for the Care and Use of Laboratory Animals (EU
542	Directive 2010/63/EU).
543	Anesthesia and Surgical Procedures
544	Rats were anesthetized using an intra-peritoneal (i.p.) injection of a 1.5 g/kg body weight
545	dose of urethane (Sigma-Aldrich, U2500). Oxygen was administered. The animal was placed on
546	a heating pad and a rectal probe was used to maintain a body temperature of 37 C. The eyes were
547	covered in ointment. After removal of the skin, the skull was leveled to 0 degrees, such that the
548	difference between lambda and bregma was less than 0.2 mm.
549	Stereotaxic coordinates and electrode placement
550	Craniotomies were made at the locations listed in the following table (Extended Data
551	<b>Table 1</b> ). Accurate electrode placement was confirmed by examining the firing properties of

559	Electrodes
558	criteria were used to verify target placement.
557	forebrain stimulation was stereotactically-guided and, when possible, electrophysiological
556	examination of brain tissue sections (Extended Data Figure 8). Placement of electrodes for
555	single units (<0.2 mV). LC electrode placements were later verified using histological
554	responsive cells in the MeV (Mesencephalic Nucleus of Cranial Nerve V) with undetectable
553	biphasic response to noxious sensory stimuli (foot shock), audible presence of jaw movement-
552	neurons in each brain region. In the LC, these criteria included a slow spontaneous firing rate,

Stimulation of cortical and sub-cortical brain regions was conducted via tungsten 560 electrodes with low impedance (10 - 50 kOhm) to prevent heating at the electrode tip. Tungsten 561 electrodes with a diameter of 200 µm (FHC, Model: UEWMFGSMCNNG) were ground at the 562 tip to lower impedance to this range. Recording from the LC used a 15 µm thick silicone probe 563 with 32 channels (NeuroNexus, Model: A1x32-Poly3-10mm-25s-177-A32). The channels were 564 implanted toward the anterior aspect of the brain. Each channel was separated from the 565 neighboring channels by 25 µm. Channels were divided into 10 tetrodes with one channel 566 overlapping per tetrode (Extended Data Figure 1). The 275 µm extent of the recording channels 567 covered nearly the entire dorsal-ventral extent of the LC, which is ~  $300 \,\mu m^{96,97}$ . 568

569 Recording and signal acquisition

570 A silver wire inserted into the neck muscle was used as a reference for the electrodes.

571 Electrodes were connected to a pre-amplifier (in-house constructed) via low noise cables. Analog

- signals were amplified (by 2000 for LC and 500 for cortex) and filtered (8 kHz low pass, DC
- 573 high pass) using an Alpha-Omega multi-channel processor (Alpha-Omega, Model: MPC Plus).

574 Signals were then digitized at 24 kHz using a data acquisition device CED, Model:

575 Power1401mkII). These signals were stored using Spike2 software (CED).

#### 576 Spike detection

The recorded signal for each channel was filtered offline with a four pole butterworth band pass (300 - 8000 Hz). Spikes were then detected as crossings of a negative threshold that was four times the standard deviation of the channel noise. Noise was defined as the median of the rectified signal divided by 0.6745 <sup>98</sup>. Detected spike waveforms were stored from 0.6 msec to 1.0 msec around the threshold crossing. This duration was chosen based on the known action potential duration of rat LC neurons <sup>2,99</sup>. A 0.6 msec refractory period was used to not detect a subsequent spike during this window.

#### 584 Spike clustering

Spike waveforms were clustered using an automatic clustering algorithm and then 585 manually refined and verified using cluster visualization software (CED, Spike 2). Automated 586 clustering was performed using Wave\_Clus<sup>98</sup> in MATLAB (default parameters for clustering) 587 followed by manual refinement and verification in clustering visualization software. This method 588 uses wavelets to decompose the waveform into a simpler approximation of its shape at different 589 frequencies (wavelet scales) and times in the waveform. Using this method, small amplitude 590 bumps or deflections at different time points in the waveform can be used to cluster waveforms 591 together, if they are a highly informative waveform characteristic. After the automated sorting, 592 manual refinement of clustering using a 3-dimensional plot of principle components or the 593 amplitude at particular waveform time points (peaks and troughs). Auto-correlograms were used 594 to assess the level of noise (refractory period violations) and cross-correlograms between 595 simultaneously recorded units were used to prevent over-clustering 100. 596

#### 597 **Detection of spikes across tetrodes**

Due to configuration of the recording array with a high-density of electrode contacts, the 598 spikes from the same LC neuron could be detected on more than one tetrode. In such situations, 599 we first attempted to merge the spike trains across multiple tetrodes. Merging the spike trains 600 potentially originating from the same neuron and detected on multiple tetrodes should reduce 601 false negatives (missing spikes), as it is common for PCA of waveforms to miss some spikes 602 even if they are part of a well isolated cluster. The assumption is that different spikes are missed 603 on different tetrodes, which were subjected to separate PCA's during clustering. Therefore, 604 605 spikes missed by PCA on one tetrode could be partly filled in by spikes that were detected on other tetrodes, providing that the tetrodes were recording the same single unit. Merging spike 606 trains across tetrodes operated on the principle that, if the spikes from the same neuron are 607 recorded, for example, on 3 adjacent tetrodes and the spike waveforms can be classified into 3 608 well-isolated clusters, then the spike trains can be merged to yield an equally well-isolated unit. 609 Furthermore, merging across spike trains allows units to be tracked if they drift away from one 610 tetrode and become closer to another tetrode. However, the merging procedure needs to avoid 611 inclusion of contaminated spikes originating from neighboring cells. Therefore, merged spike 612 trains must be statistically tested for false positives and conservatively discarded. Unit cluster 613 contamination from other units are typically detected by the presence of spikes during the 614 refractory period. Thus, if the merged spike train did not meet criteria for a single unit activity, 615 616 then we kept the unit recorded on the tetrode with the least noise (lowest proportion of spikes during refractory period). 617

The merging process consisted in the following steps. First, the cross-correlograms were computed at the sampling rate of the recording (0.04 ms bin width) between the spike trains of a

620 cluster isolated from one tetrode ("reference" cluster) and all other clusters isolated from all remaining tetrodes. If the spike trains associated with the two clusters contained spikes from the 621 same unit, then the majority of spikes would have identical timing with the vast majority (>90%) 622 of spikes being coincidental at time 0 (with a few sampling points of error) and the remaining 623 spikes being spikes either detected on one tetrode and missed on the other or cluster noise from 624 other units. Prior recordings using high-density linear electrodes have used cross-correlograms to 625 simply discard one of the trains <sup>101</sup>; however, we used merging across tetrodes to reduce missed 626 spikes. In the case that the "reference" and "other" spike trains were mostly coincidental spikes, 627 we attempted to merge them using a procedure, as follows. The coincident spikes in the 628 reference spike train were deleted and the remaining reference spikes were merged with the 629 spikes from the other spike train, resulting in a new "merged" spike train. The amount of noise 630 (number of spikes during the refractory period) and total number of spikes in the train were 631 recorded for the original "reference" spike train, original "other" spike train, and newly merged 632 spike train. A Fisher's Exact Test was performed to statistically assess if the proportion of 633 contaminated spikes added by merging is significantly greater than the proportion of noise 634 (refractory period) spikes in either the original reference spike train or the original other spike 635 train. The Fisher's test was run separately for merged versus reference and the merged versus 636 other spike trains. A result of non-significance (with alpha set to 0.01 and a right-sided test) for 637 *both* the original reference spike train and the original other spike train indicated that the original 638 spike trains do not have greater odds of having noise than the merged spike train. In this case, 639 the merged train may be kept because the amount of noise was not increased beyond its level in 640 the original two trains. The original spike trains were discarded. However, if the test is 641 642 significant for either of the original trains, then either the reference spike train or the other spike

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643	train is kept depending on which has a lower percentage of spikes during the refractory period
644	out of the total number of spikes. The merged spike train was discarded. The merging procedure
645	was repeated for each cluster from each tetrode until conflicts no longer existed.
646	Characterization of LC units
647	Single units were identified using typical criteria (Extended Data Figure 1). These criteria
648	were low firing rate (0.89 spikes/sec) and a characteristic bi-phasic response (excitation followed
649	by inhibition) to sensory stimuli. The neurochemical nature of LC units was identified by the
650	presence of auto-inhibitory alpha-2 adrenergic receptors which were activated using the alpha-2
651	agonist, clonidine. Electrode tracks approaching LC were visualized (Extended Data Figure 8).
652	These methods are the standard for demonstrating that the neurons are likely to be LC-NE
653	neurons. Therefore, our results are comparable with the existing literature on the LC and we
654	were likely sampling mostly LC-NE neurons.

# 655 Assigning unit location on recording array

Isolated single units were assigned a channel location on the electrode array according to 656 which electrode measured the highest mean waveform amplitude (averaged from all spikes). In 657 the case of single units with spikes that were merged across tetrodes, a list tracked the tetrodes on 658 which the unit appeared and the location was assigned to the channel with the maximum 659 amplitude when considering all of the tetrodes that recorded the unit. The spacing between all 32 660 661 channels was 25 µm, which allowed us to use Pythagoras' Theorem to calculate a distance between channels on the array. The distance between each unit's maximal waveform amplitude 662 was used to measure the distance dependence of spike count correlations and cross-correlograms. 663 664 We inferred the spatial probability distribution of narrow and wide units on the array by fitting  $N^{th}$ -order polynomials (N = 2 to 9) to the proportion of each unit type recorded at each of 665

666	the 10 tetrodes. We found that $N = 5$ or 6 produced an $R^2$ that was > 0.9, whereas lower N had
667	poor fits ( $R^2=0.3$ to 0.7) and larger N visually overfit the data. The polynomial function provided
668	a probability, which we verified in all rats by removing one rat and re-calculating the fit until all
669	rats had been removed once (jackknife error). In all cases, except one, $R^2$ was >0.9.
670	Sensory stimuli
671	Sensory stimuli were foot shocks delivered to the contralateral hind paw. Pulses were
672	square, biphasic, and 0.005 msec duration at 5 mA. Pulses were delivered at two frequencies
673	(single pulse or five pulses at 30 Hz) delivered in random order. Fifty trials of foot shock stimuli
674	were delivered with an inter-trial interval of 2000±500 msec.
675	Intra-cranial stimulation
676	Brain regions were stimulated in a random order. Pulses were square, biphasic, and 0.25
677	msec duration over a range of intensities (400 - 1200 $\mu$ A), which were delivered in a randomized
678	order. The pulse waveforms were constructed in Spike2 (CED) and delivered via a current
679	generator (in-house constructed), which allowed recording of the stimulation voltage at the tip of
680	electrode, which was also digitized and stored and used to verify stimulation. Stimulation was
681	delivered with an inter-trial interval of 2000±500 msec. At least 50 trials of each intensity were
682	delivered for each brain region.
683	Administration of clonidine
684	At the end of the recording, a 0.5 mg/kg dose of the alpha-2 adrenergic agonist clonidine
685	was injected i.p. (Sigma-Aldrich, product identification: C7897). The recording was continued at
686	least until all activity, included multi-unit activity, ceased.
687	Histology

688	Rats were euthanized with pentobarbital sodium (Narcoren, Merial) via an i.p. injection
689	(100 mg/kg). The rats were then trans-cardially perfused with 0.9% saline and then 4%
690	paraformaldehyde (PAF) in 0.1M phosphate buffer (pH 7.4). The brain was removed and stored
691	in 4% PAF. Brains were moved into 30% sucrose, until they sank, before sectioning on a
692	freezing microtome (Microm, model: HM 440E). Coronal sections (50 $\mu$ m thick) were collected
693	into 0.1M phosphate buffer and directly stained. For sections containing the LC, alternating
694	sections were stained for Nissl substance or the catecholamine synthesis enzyme, tyrosine
695	hydroxylase (TH). Sections containing cortical and sub-cortical regions were stained for Nissl
696	substance. Staining for TH was performed using a 1:4000 dilution of monoclonal mouse anti-TH
697	antibody (ImmunoStar) and a 1:400 dilution of biotinylated, rat absorbed anti-mouse secondary
698	antibody (Biozol) in PB. The antibody was visualized using a DAB and horse radish peroxidase
699	reaction with hydrogen peroxide using a standard kit (Biozol, model: Vectastain Elite ABC-
700	Peroxidase Kit CE). After staining for TH or Nissl, sections were mounted on gelatin-coated
701	glass slides. Nissl stained and slide mounted sections were dehydrated in an alcohol series. Slides
702	were cleared (Carl Roth, Roti-histol) and cover slipped with DPX slide mounting media (Sigma-
703	Aldrich, catalog number: 06522).

# 704 Data analysis: Spike count correlations

The Pearson's correlation coefficient was used to quantify the correlation between spike counts. Spontaneous spiking excluded the 1 sec period following foot shock stimulation or intracranial stimulation. Spontaneous spikes were also excluded during inactive periods in which the rate was less than 0.5 Hz due to quiescence of all single and multi-unit activity in the LC (paradoxical sleep  $^2$ ). Spontaneous spike count correlations were then calculated from the time bins (200 msec or 1000 msec) in which both neurons were active. 711 Poisson spike trains should generate some degree of synchrony (spike count correlation coefficient) by chance. We compared the correlation coefficient for each pair against 500 712 surrogate spike trains for the same pair. The trains were generated in manner that preserved the 713 714 inter-spike interval (ISI) distribution for each unit and the slow (<2 Hz) oscillations in spike rate (thought to be generated by brain network-wide interactions under anesthesia). Each surrogate 715 spike train had the same oscillation phase preference, the same number of spikes per oscillation 716 cycle, and an identical ISI distribution, but the precise spike timing of each unit in relation to 717 other units is randomized. 718

Evoked spike count correlations after foot shocks were calculated from the trial-by-trial spike count in a single window after stimulus onset (50 msec). This window was chosen based upon the timing of the spiking evoked by a single pulse foot shock in our recordings, as well as reports by others <sup>16,49</sup>. For evoked correlations, the spiking on each trial was sparse in the 50 msec window, so a statistical permutation test was under-powered and could not be performed.

724 **D** 

#### Data analysis: Cross-correlograms

We calculated cross-correlograms between spike trains. Significant changes in 725 coincidental spike count were detected by comparing the observed counts to 1000 surrogate 726 cross-correlograms generated from jitter spike times <sup>102</sup>. This approach uses the data to determine 727 the degree of coincident spiking expected by chance and it also excludes synchrony due to 728 interactions at slower time scales than those of interest. Briefly, the spike times for each unit 729 were jittered on a uniform interval and a surrogate cross-correlogram was calculated between the 730 jittered spike times; this process was repeated 1000 times. Significant cross-correlogram bins 731 were those that crossed both a 1% pairwise expected spike count band and a 1% globally 732 733 expected spike count band (the maximum and minimum counts at any time point in the cross-

734 correlogram and any surrogate cross-correlogram). For broad-type interactions, the crosscorrelograms were calculated in a window of 2000 msec, a bin size of 10 msec, and a uniform 735 jitter interval of  $\pm 200$  msec. Any significant coincidental spiking excludes synchrony due to co-736 variation of spiking on a timescale of a few hundred milliseconds. For sharp-type interactions, 737 we used a window of 3 msec, a bin size of 0.05 msec, and a uniform jitter interval of  $\pm 1$  msec. 738 To ascertain if we missed interactions at other timescales, we employed the method of 739 integrating the cross-correlogram <sup>36</sup>. The gradual integration of the cross-correlogram in 740 successively larger windows (e.g.,  $\tau = \pm 5$  msec, 10 msec, ...40,000 msec) will result in a curve 741 that changes rapidly during tau with a large concentration of coincidental spiking and will 742 743 eventually plateaus at very large tau at which the firing patterns of the pair is unrelated. We 744 integrated in 1 msec steps from 0 to 40 sec and recorded the start of the plateau. The results of 745 this analysis suggested that some interactions could occur on the level of a few seconds. Thus, we calculated additional cross-correlograms using a window of 20 sec, a bin size of 0.2 sec, and 746 747 a uniform jitter on the interval of  $\pm 2$  sec.

#### 748 **Data analysis: Syn-fire chain analysis**

Repeating sequences of triplets of neuronal spiking were measured using three steps: (i) a 749 spike-by-spike search, (*ii*) template-formation, and (*iii*) template matching algorithm <sup>103,104</sup>. The 750 analysis stepped through all simultaneously recorded units  $n \rightarrow N$  and all of the spike times (M) 751 for each unit  $(n_{m \to M})$ . The spike search started with the first unit and its first spike,  $n_m$ . This 752 spike time was a reference event marking the start of a 2 msec window during which we 753 identified any other spiking units. The sequence of units and the delay between their spikes was 754 stored as a template. For example,  $n_m$  might be followed 1.1 msec later by a spike from unit n =755 5 which is subsequently followed 0.8 msec later by a spike from unit n = 30. This forms a 756

757	template of $1 - 5 - 30$ with delays of 1.1 msec and 0.8 msec. The next step, template matching,
758	would proceed through the spikes $I_{m+1 \rightarrow M}$ and attempt to match the template and its delays. A 0.4
759	msec window of error was allowed around each spike in the original template for matching.
760	Thus, for each spike of unit $n = 1$ , unit $n = 5$ could spike between 0.7 msec and 1.5 msec after
761	unit $n = 1$ and unit $n = 30$ could spike 0.4 msec to 1.2 msec after unit $n = 5$ . A template match
762	would be counted if the spikes of the other units aligned with the originally formed template. For
763	each template, the total number of observations was compared to the number of observations in
764	the top 1% of 100 surrogate data sets in which spike times were jittered on a uniform interval by
765	1 msec. Any sequential spike patterns that occurred more often than expected by chance were
766	counted as significantly occurring chains of spikes.

#### 767 Data analysis: Graph theory analysis and ensemble detection

For each rat, a graph was constructed with each unit as a node. Links were drawn 768 769 between units with strong spike count correlations, following the methods of Rubinov & Sporns (2010) and Bruno et al. (2015)<sup>105,106</sup>. The threshold for drawing a link was set as the highest 770 possible value such that the mean network degree was less than the log(N), where N is the 771 number of nodes in the graph <sup>107</sup>. Units without strongly correlated activity were left unlinked. 772 773 The resulting network was represented by a binary adjacency matrix. Ensembles were detected 774 by segregating nodes into groups that maximize the number of links within each group and 775 minimizes the number of links between group. The iterative optimization procedure used a 776 Louvain community detection algorithm to maximize a modularity score (Q) quantifying the degree to which groups separate 106,108. The degree of ensemble separation (Q) was compared to 777 modularity scores from 1000 from shuffled networks. If Q was higher than the top 5% of the 778 779 1000 surrogate values, then adequate separation of units into ensembles was achieved. All graph theory and ensemble detection analyses were implemented in MATLAB using the Brain

- 781 Connectivity Toolbox <sup>109</sup>.
- 782 Data analysis: Oscillations in spike count

Single unit spike trains were first convolved with a Gaussian kernel with a width of 250 783 msec and a sampling rate of 1 msec. The resulting spike density functions (SDF) were analyzed 784 for the power of oscillations, the phase of oscillations, and the coherence between pairs of 785 SDF's. The power spectral density of each spike train was calculated using a multi-taper method 786 in MATLAB (Chronux Toolbox)<sup>110</sup>. We used 19 tapers with a time-bandwidth product of 10. 787 The frequency band was 0.01 to 10 Hz. We used finite size correction for low spike counts. 788 Instantaneous phase was extracted by first filtering the SDF with a 3<sup>rd</sup> order Butterworth filter at 789 a particular frequency of interest (0.09 to 0.11 Hz and 0.40 to 0.48 Hz) and then obtaining phase 790 791 from the Hilbert transform of the signal. The consistency of the instantaneous phase difference between each unit pair was assessed using Rayleigh's Test for Circular Uniformity (p < 0.05), 792 which was implemented in MATLAB (CircStat Toolbox)<sup>111</sup>. Coherence between pairs of units 793 794 was calculated using the Chronux Toolbox in MATLAB with the same parameters used for calculating the power spectral density. Coherence and power were averaged across all single 795 units and smoothed with a width of 0.15 Hz. 796

# 797 Data analysis: Spike-LFP phase locking

Local field potential (LFP) was recorded in the prefrontal cortex. The LFP was lowpass filtered with a  $3^{rd}$  order Butterworth filter at 2 Hz. The instantaneous phase was obtained by Hilbert transformation. Spike times corresponded to LFP phases. For each single unit, the phase distribution was tested for significant locking to cortical LFP using Rayleigh's Test for Circular Uniformity (p<0.05).

### 803 Data analysis: Antidromic spiking

Forebrain regions were stimulated in a randomized order with single pulses at currents of 804 400, 600, 800, 1000, and 1200 µA. Stimulation was delivered with a 2 sec inter-trial interval 805 with 500 msec jitter. Peri-stimulus time histograms were Z-scored to 1 sec before stimulus onset. 806 807 If a single bin (5 msec), but no other bins, exceeded a Z-score of 5, then the unit was marked as antidromically activated. The bin size was chosen, based on prior work, which has demonstrated 808 that 3 or 4 msec of jitter occurs when stimulating LC fibers because they lack myelin<sup>112</sup>. This 809 810 rationale is based on an extremely low chance of consistent spiking within the same 5 msec 811 window by slowly firing neurons (typical ISI is longer than 100 msec). However, manual inspection of the individual spike rasters was used to confirm the results. 812 813 **Data analysis: statistics** 814 Data were tested for normality using a Shapiro-Wilk test (alpha = 0.05) and homogeneity of variance (alpha = 0.05) using an F-test (vartest2 in MATLAB) for 2 groups or Levene's Test 815 816 (vartestn in MATLAB) for more than 2 groups. If data were not normal, then a Wilcoxon-Mann-Whitney Test was used for 2 groups or a Kruskal-Wallis Test for more than 2 groups; otherwise, 817 a two-sided t-test or between-subjects one-way ANOVA was used. If variance was 818 inhomogeneous, then we used Welch's t-test or Welch's ANOVA. For ANOVA (or Kruskal-819 Wallis), post-hoc testing between individual groups was performed using the MATLAB 820 function, multcompare (with Dunn-Sidak correction for Kruskal-Wallis). If a Welch's ANOVA 821 822 was used for heteroscedastic data, then post-hoc testing was performed using the Games-Howell test. These comparisons were unplanned. Mean and standard error are reported for normally 823 824 distributed data. Median and standard deviation are reported for data that were not normally distributed. 825

We report effect sizes as Cohen's D for analysis of 2 groups (e.g., t-test or Wilcoxon-Mann-

827 Whitney) or, for analysis of more than 2 groups, we report  $\omega^2$  (e.g., ANOVA) or  $\omega^2_{adj}$  (e.g.,

828 Welch's ANOVA). For 2 x 2 tables, we used a Fisher's Exact Test, for which the effect size is

quantified by the Odds Ratio (OR), which we converted to Cohen's D (termed  $D_{or}$ )<sup>113</sup>.

$$D = \frac{\mu_1 - \mu_2}{S_p}, S_p = \sqrt{\frac{(n_1 - 1)\sigma_1^2 + (n_2 - 1)\sigma_2^2}{n_1 + n_2 - 2}}$$
$$D_{or} = \ln (OR) \times \frac{\sqrt{3}}{\pi}$$
$$\omega^2 = \frac{SS_{between \ groups} - (df_{between \ groups} \times Mean \ Squared \ Error)}{Mean \ Squared \ Error + \ SS_{total}}$$

$$\omega_{adj}^2 = \frac{df_{between\ groups} \times (F-1)}{df_{between\ groups} \times (F-1) + N}, N = number\ of\ samples$$

In the case that a null hypothesis was rejected, we made a post-hoc determination that the sample size and statistical test provided adequate power to reject the null hypothesis. The power was calculated with sampsizepwr in MATLAB for 2 groups. If there were more than 3 groups, then the power was calculated using powerAOVI in MATLAB. We are unaware of methods for assessing the power of a Kruskal-Wallis Test or a Welch's ANOVA and do not report power for those tests.

For circular data, uniformity was assessed using Rayleigh's Test for Circular Uniformity (alpha = 0.05). These calculations were made using the CircStat toolbox in MATLAB <sup>111</sup>. Power calculations were not made for circular statistics.

#### 839 Data availability statement

840 The generated datasets for this study are available from the corresponding author on841 reasonable request.

# 842 **Code availability**

843 The code used for data analysis are available from the corresponding author.

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Rat Identifier	Number of single units	Number (%) of narrow type	Number (%) of wide type
959.1	7	5 (71)	2 (29)
980.4	9	9 (100)	0 (0)
105.1	5	0 (0)	5 (100)
105.2	52	10 (19)	42 (81)
109.1	21	0 (0)	21 (100)
134.2	15	0 (0)	15 (100)
259.1	18	0 (0)	18 (100)
259.2	27	4 (15)	23 (85)
263.2	36	2 (6)	34 (94)
286.3	8	3 (38)	5 (62)
288.1	6	0 (0)	6 (100)
288.2	30	1 (3.3)	29 (96.7)

**Table 1. The number of LC single units recorded in each rat.** The numbers (and percent) of each unit type are listed. Both unit types were often recorded simultaneously, but narrow units were recorded in 7 out of 12 rats, possibly because of fewer units with narrow waveform reducing their probability of detection.

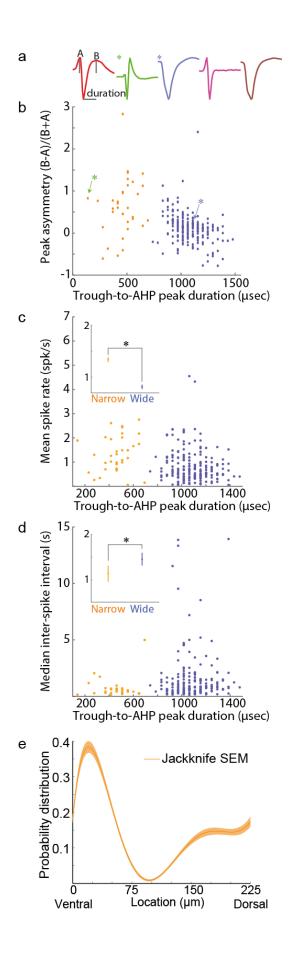
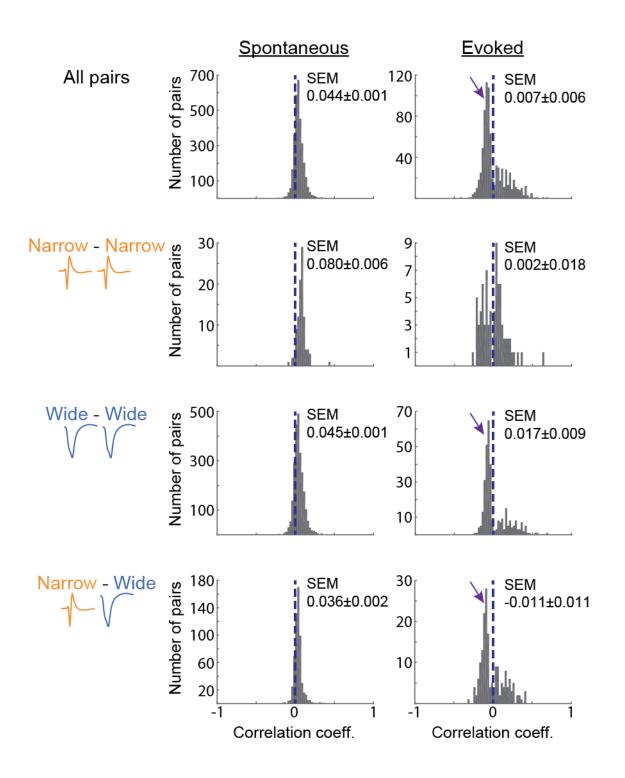
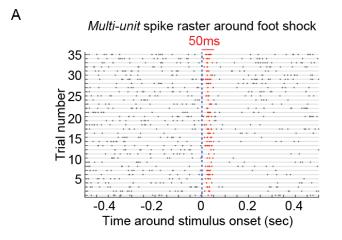


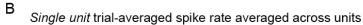
Figure 1. Distinct populations of LC single units were separable by waveform shape, spike rate, and responsiveness to prefrontal cortex stimulation. (A) The average waveforms of 5 example units illustrate the diversity of waveform shapes in the LC. (B) Units were separable based on the waveform duration and the amplitude of the after-hyperpolarization in relation to the first peak. The green and blue asterisks refer to the example waveforms in panel A with the same markings. (C, D) Scatter plots with the mean spontaneous spike rate and inter-spike interval for each isolated LC unit. The insets on C and D show the mean and standard error for each unit type. N = 34 (narrow) and 200 (wide) units. (E) Narrow type units were predominantly distributed in the ventral aspect of the nucleus and sparsely recorded elsewhere in the nucleus. The mean and standard error of the probability distribution function is plotted.



**Figure 2. Pairwise spike count correlations are near zero and anti-correlations are cell type specific.** The distribution of spike count correlation coefficients is around zero (dotted blue line) during spontaneous spiking (left panel) or following single pulse foot shock stimulation (right

panel). Spike count correlations are plotted separately for pairs of narrow units, pairs of wide units, and pairs of mixed unit type according to the labels on the left of the histograms. N = 100(both narrow type units), 2480 (both wide type units), and 584 (mixed unit type) pairs. Prominent negative correlations are apparent after evoked foot shocks (arrows, right panel). These negative correlations only occur in pairs containing a wide unit.





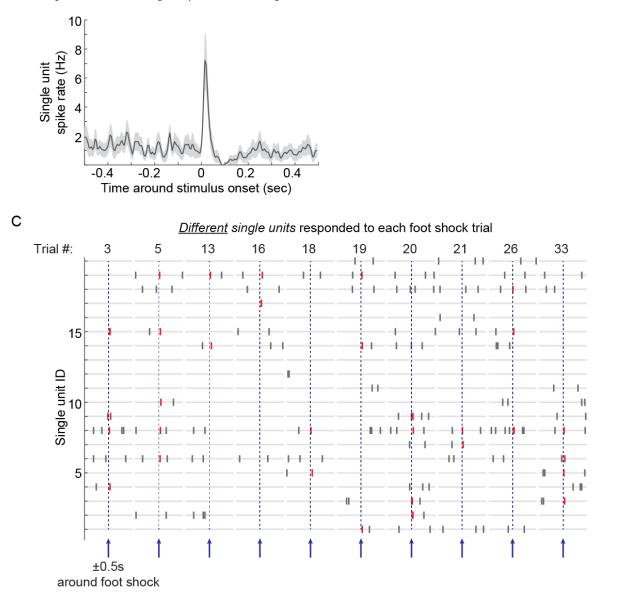
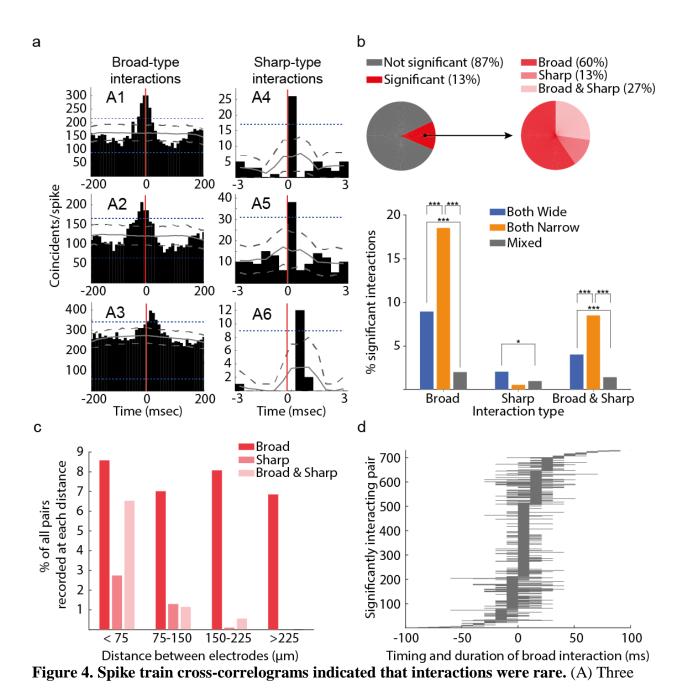


Figure 3. The response to single pulse foot shock engaged different LC units on each trial. The figure shows an example recording of 20 units. A. The spike raster (trials are rows) after all simultaneously recorded single unit spike trains were merged into a single multi-unit spike train per rat. The red ticks indicate spiking during the first 50 msec after stimulation (i.e., the population phasic burst of spikes). The phasic response is followed by noradrenergic-mediated auto-inhibition. The plot depicts 20 units from one rat. B. The trial-averaged peri-stimulus spike rate histograms for single units were averaged. The plot is the mean and standard error of across single units (N = 20 single units, same as in A, and bin size of 5 msec). This plot shows that single units, on average across trials, exhibit a phasic burst followed by inhibition. C. The spike raster of the same 20 units (y-axis) is plotted for 500 msec before and 500 msec after foot shock (arrows) on 10 randomly selected trials. The spikes of each single unit that occur during the 50 msec window that encompasses the LC phasic burst (in A and B) are colored in red. At the level of single trials, different single units responded on different trials. For example, unit 15 responded during the 50 msec after foot shock only on trials 3, 5, and 26; whereas unit 14 responded on trials 13 and 19. This randomness reduces the trial-by-trial evoked spike count correlation coefficients (see Figure 2).

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example cross-correlograms with significant coincidental spiking on the timescale of broad-type interactions (A1-A3) and sharp-type interactions (A4-A6). Broad-type interactions lasted for tens of milliseconds, whereas sharp-type interactions were extremely brief (less than 1 millisecond). An interaction was counted if a significant number of coincidental spikes crossed both a pairwise 1% threshold (dotted grey lines) and a 1% global threshold (dotted blue lines) obtained from a

surrogate data set of 1000 cross-correlograms computed from jittered spike times. The mean of the 1000 surrogate cross-correlograms is a solid grey line. (**B**) A minority of cross-correlograms (13%) had a significant number of coincidental spikes in at least one bin. A larger percent of the pairs of narrow units had significant broad-type interactions in comparison to pairs of wide units or pairs of both unit types. (**C**) The percent of pairs with broad-type interactions was similar regardless of the distance between the units in the pair. On the other hand, sharp-type interactions occurred only between spatially confined units. (**D**) Out of the pairs with significant broad-type interactions, the timing of the interaction peak and the duration (continuous bins above the significance threshold) is plotted for each pair. These interactions occurred over a broad time range. Peaks were not exclusively centered at time 0 with a symmetrically spread around time 0 (as in panel A1).

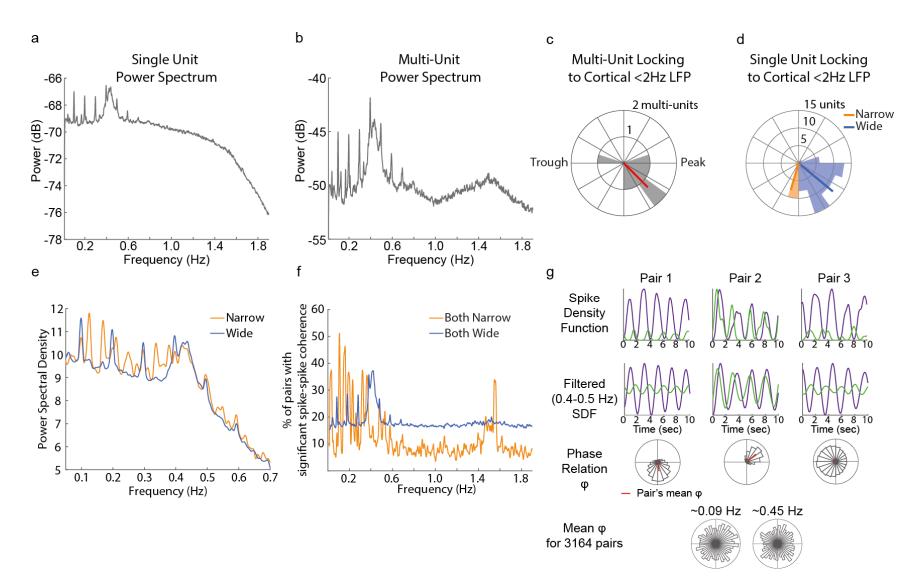


Figure 5. Spike rates oscillated asynchronously across individual LC units and different cell types responded at distinct phases of cortical slow oscillations. (A) Single unit spike trains were converted to spike density functions (SDF) and their power spectra

were calculated. The plot shows the mean power spectrum across all single units. Two oscillatory regimes at 0.09 Hz and between 0.4 and 0.5 Hz were observed in single unit spike trains. (B) Merging simultaneously recorded single unit spike trains into one multi-unit spike train before constructing a SDF revealed spectral power at the infra-slow frequencies (0.09 Hz and 0.4-0.5 Hz), as well as at around 1 - 2 Hz. (C) Multi-unit spiking was phase locked to the trough-to-peak transition reflected by the phase of cortical delta oscillations. The polar plot is a histogram of the number of multi-units at each bin of cortical LFP phase. The red line is the mean across multi-units. (D) Single units were also phase locked to the cortical delta oscillation, in spite of not rhythmically spiking at that frequency (A). Narrow units responded significantly earlier than wide units during the cortical delta oscillation. The wide units preferentially fired at 320 degrees, whereas the mean angle for narrow units was 254 degrees (the trough, or down state, was 180 degrees and the zero-crossing between the trough and the peak was at 270 deg). (E) Wide and narrow units both oscillated at infraslow frequencies (0.09 Hz and 0.4-0.5 Hz), but narrow unit spike trains had additional peaks of spectral power between 0.1 and 0.2 Hz. (F) The spike counts of narrow and wide units fluctuated coherently at a range of infra-slow and slow frequencies. The percent of pairs with significant spike-spike coherence is plotted for pairs of narrow units and pairs of wide units. Pairs of wide units oscillated together at 0.09 Hz and 0.4-0.5 Hz. Pairs of narrow units oscillated together at different infra-slow frequencies and at approximately 1.5 Hz. (G) The spike rates of 3 example pairs over a 10 sec period are plotted as spike density functions (top panel) and filtered for 0.4-0.5 Hz (middle panel). The bottom panel is a histogram of the phase differences ( $\phi$ ) between the units' oscillations over the entire recording session. The units in each pair oscillated coherently with narrow distributions of phase differences, but only the units in Pair 2 oscillated nearly synchronously (i.e., with ~ 0 degrees of phase difference). The mean  $\varphi$  for each example pair is marked by the red

line on the polar plot. Note that the phase angle histograms and mean  $\varphi$  illustrate the stable phase consistent relationships between pairs over the entire recording (often multiple hours), not only the 10 sec plotted in the above panels. At the population level of all 3164 pairs, the mean  $\varphi$  across pairs are distributed uniformly across all phases. A pair was included in the population histogram if its distribution of phase relations was significantly non-uniform (Rayleigh's Test for Circular Uniformity, p<0.05), as in the 3 example pairs.

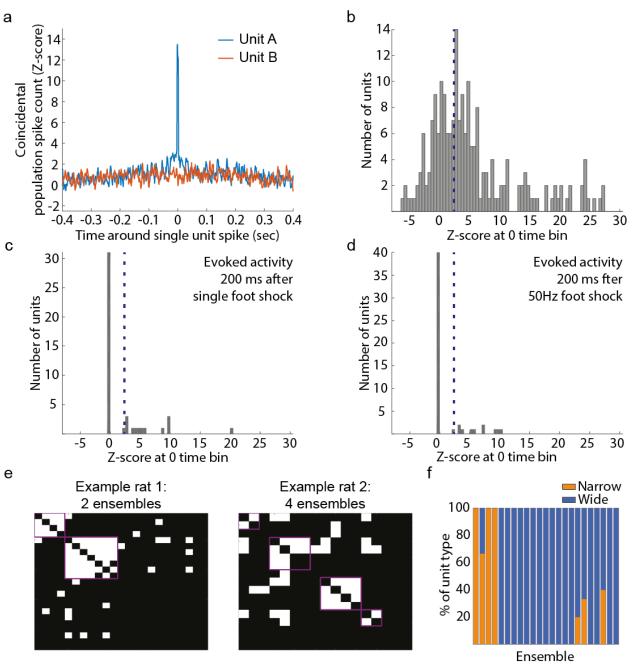


Figure 6. LC single units have diverse coupling to the population and organize into

ensembles of homogenous unit type. (A) Population coupling was calculated as the crosscorrelogram between each single unit and the merged spike train of all remaining single units that were simultaneously recorded. The cross-correlogram was calculated with 1 msec bins over a period of  $\pm 400$  msec and Z-score normalized to the period between 300 and 400 msec (edges of the cross- correlogram). Example unit A illustrates a case of strong population coupling. Spikes of unit A coincided with spikes of many other units recorded simultaneously. Example unit B illustrates a lack of population coupling. (**B**) A histogram of the population coupling strength (Z-score at time 0) illustrates the broad range of population coupling strength across LC single units. Dotted lines show a Z-score of 2 for reference. (**C**, **D**) Population coupling using spikes during the 200 msec after a single foot shock (C) or after a brief train of foot shocks (5 mA pulses at 30 Hz) (D). As with spontaneous activity, many single units are not coupled to the population, with the exception of those units on the right tail of the distribution. (**E**) Two examples of ensembles detected in two rats. White dots indicate correlated units. Magenta lines outline ensembles. Ensembles are defined as correlated activity between two or more single units. All simultaneously recorded single units were treated as a network with links between correlated pairs and ensembles were detected using community detection algorithms on the network. (**F**) The percent of each unit type making up each ensemble. Each bar is one of 23 ensembles. The majority of units in each ensemble were the same type.

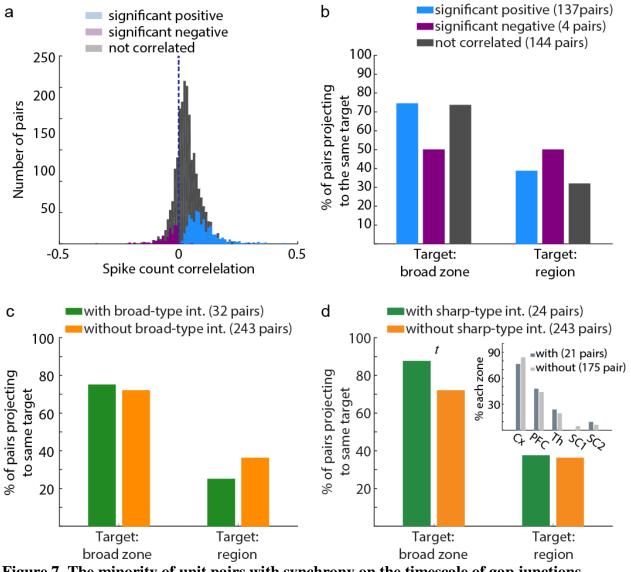


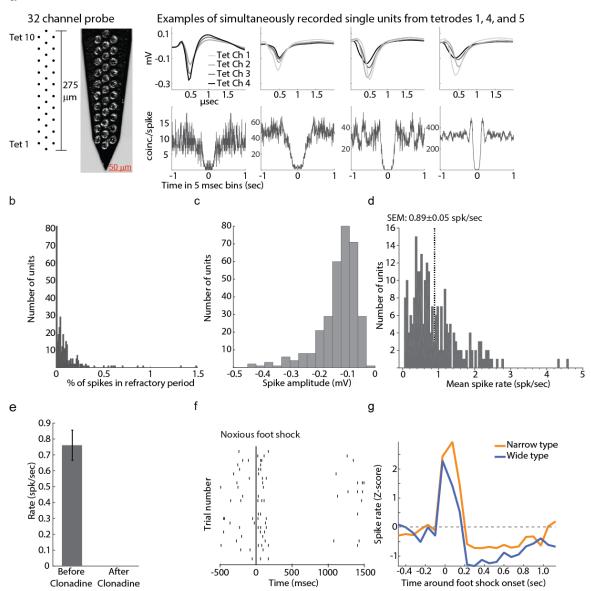
Figure 7. The minority of unit pairs with synchrony on the timescale of gap junctions

**provided targeted forebrain neuromodulation.** (**A**) Spike count correlations coefficients were divided into highly correlated pairs (Pearson's correlation coefficient, p<0.001) with positive (blue) or negative (purple) correlations. (**B**) The percent of pairs with both units jointly projecting to the same forebrain target did not differ between pairs with correlated activity (blue), anti-correlated activity (purple), and non-correlated units (grey). The percent is out of the total number of units indicated in the figure legend. Targets were defined as either individual brain regions or as zones (i.e., cortical, sub-cortical, thalamic, prefrontal, primary sensory cortex,

or secondary sensory cortex). Zones were examined because prior work has indicated that single LC neurons may project to multiple, functionally-related forebrain sites <sup>114</sup>. (**C**) The percent of pairs with overlapping projection targets did not depend on the pair having a network interaction. (**D**) Pairs with gap junction interactions had a significantly greater likelihood of projecting to the same forebrain target zone.

### **Extended Data**

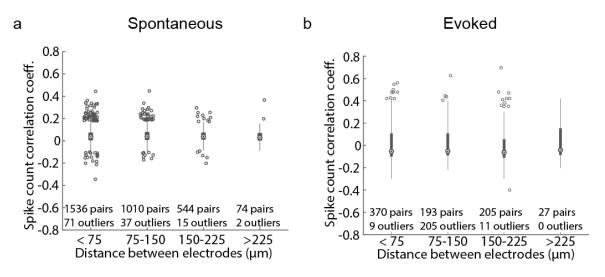
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Extended Data Figure 1. Characterization of single unit spontaneous activity,

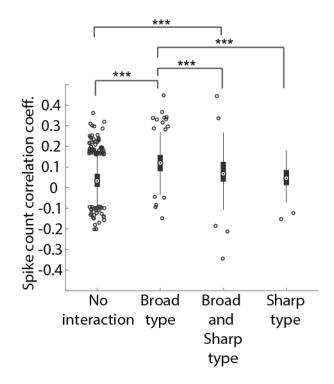
**response to sensory stimuli, and clonidine.** A. Units were recorded using a silicone shank with 10 tetrodes. Each tetrode contained 4 channels with one channel overlapping with the adjacent channel. The probe was advanced until units on all channels were responsive to foot shock and inhibited by clonidine. The rightward panel shows the

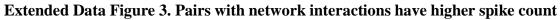
average waveforms recorded on each tetrode channel for 4 units recorded on 3 different tetrodes. Below the waveforms, the auto-correlograms show a typical inter-spike interval of > 100 msec. B. A histogram showing the distribution of refractory period violations (set at a conservative limit of 10 msec) across all units. Overall, the proportion of spikes during the refractory period was < 2% with most neurons having fewer than 0.25% of their spikes during the refractory period. C. A distribution of single unit spike amplitudes taken from the tetrode channel with the maximal waveform. Spikes were, in general, of high amplitudes allowing reliable detection and sorting of spikes. D. The distribution of single unit firing rates shows that firing was typical of the LC with a mean of 0.89 spikes per sec. E. Units were inhibited by clonidine. The average firing rate before and after clonidine is plotted. F. An example raster showing the biphasic response to foot shocks (at t=0 msec). Each row is a trial and the ticks represent spikes. G. The normalized mean response profile for narrow and wide units is plotted around foot shock onset at time 0. This plot illustrates the response to a burst of foot shocks (5mA pulses delivered at 30 Hz).



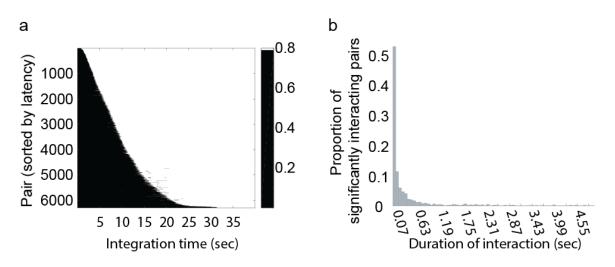
Extended Data Figure 2. Spike count correlation coefficients did not depend on

**distance between unit pairs.** The distance between units was estimated as the distance between the electrode contacts that recorded the maximal amplitude of each unit. Data are plotted as box plots. bioRxiv preprint doi: https://doi.org/10.1101/109710; this version posted November 7, 2017. The copyright holder for this preprint (which was not certified by peer review) is the author/funder. All rights reserved. No reuse allowed without permission.



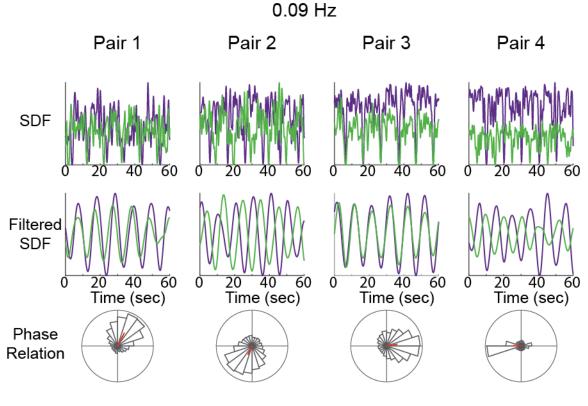


correlations.



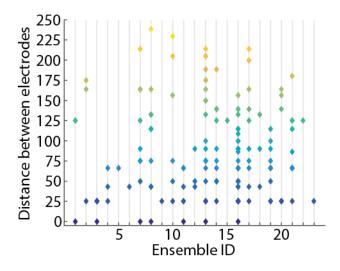
Extended Data Figure 4. Synchrony in spike train cross-correlograms over the time scale of seconds was extremely rare. (A) The cumulative correlation coefficient was obtained at various tau by integrating over successively larger windows of the spike train cross-correlograms calculated over a ±40 sec window in 5 msec bins. For each recorded pairwise cross-correlogram (considered in both directions) on the y-axis, the value of the cumulative correlation coefficient (black-white color) is plotted against tau (in seconds, x-axis). The tau at which the integration saturates is approximated at 0.8 (white). This point estimates when the majority of an interaction (a bump on a cross-correlogram) has ended and thus gives an overview of the timescale of interactions present in the data. This analysis indicated that interactions may occur up to 20 sec. (B) In order to test for interactions between 20 msec and 20 sec in duration, we calculated cross-correlograms and measured the duration of the interaction (excess coincidental spikes beyond the 1% pairwise global confidence interval derived from a surrogate sets of  $\pm 2$  sec jittered spike trains). The analysis revealed that the majority of significant interactions have a duration of under 1 sec with many lasting approximately 70 msec.

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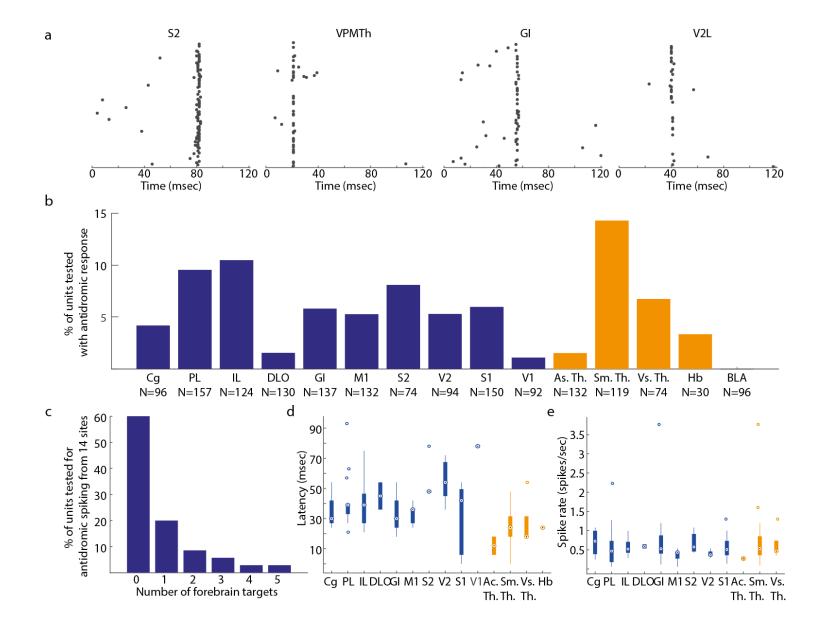


- Pair's mean phase difference

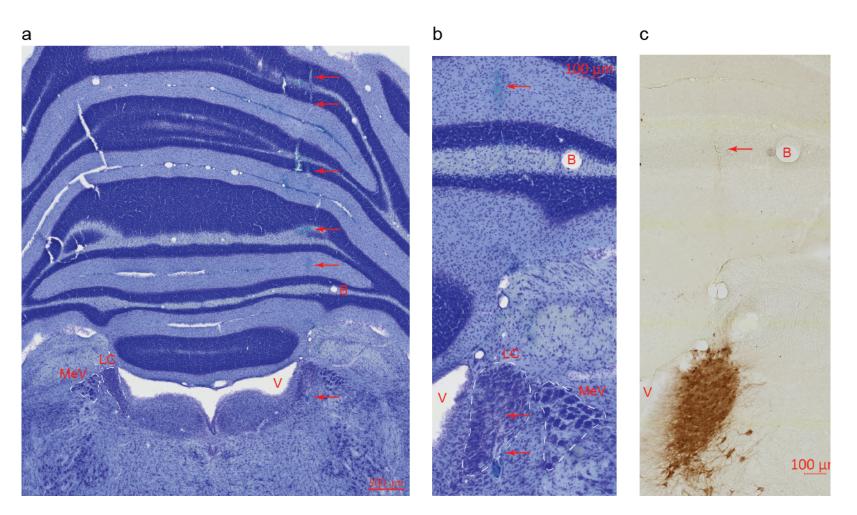
**Extended Data Figure 5. Examples of pairwise spike rate oscillations at 0.09 Hz.** The top and middle panels shows spike density functions over a small recording segment; the bottom panels show the phase relation between the units in the pair over the entire session. The mean phase relation for each pair is marked by the red line. All example pairs had a significantly non-uniform (Rayleigh's Test for Circular Uniformity, p<0.05).



**Extended Data Figure 6. Ensembles are spatially diffuse.** The pairwise distance between all pairs within an ensemble are plotted for all 23 ensembles. The y-axis and the color indicate the distance between all unit pairs in each ensemble.



Extended Data Figure 7. A summary of forebrain projection patterns and latencies. (A) Examples spike rasters showing the timing of antidromically-drive spikes. The jitter of a few milliseconds and lack of consistent response on every trial is typical of unmyelinated LC axons <sup>112</sup>. (B) Single units projected to a variety of forebrain sites. The y-axis shows the percent of units projecting to each site. The total number of units tested for projections to each site is written on the x-axis. Cortical regions are in blue and subcortical regions are in orange. (C) A mixture of broad (multiple targets) and selective (single target out of 15 regions tested) projection patterns were observed. Antidromic activation of units after stimulation ranged from 1 to 5 forebrain sites. Selective projections are in agreement with prior anatomical studies that traced projections of single LC neurons<sup>29</sup>. The average number of projections per single unit with antidromic spiking was  $2.0\pm0.3$ , which is similar to the  $1.6\pm0.8$  projection targets reported using barcoded RNA<sup>29</sup>. (D) A box plot shows the latency of antidromic spikes elicited by stimulation of different forebrain sites. The latency of antidromic responses was shorter for sub-cortical stimulation sites compared to the cortical sites and latencies for more posterior cortices were longer in comparison to more anterior cortices. This is consistent with the LC projections, which pass through thalamus before entering anterior cortex and then traveling to the posterior cortex <sup>115</sup>. (E) The mean spike rate of LC single units did not depend on their projection target, although there was a tendency for PFC-projecting units to spike at a higher rate than M1-projecting units (M1 v.s. ACC: T(9)=-2.18, p=0.063; M1 v.s. PL: T(20)=-1.07, p=0.296; M1 v.s. IL: T(18)=-2.282, p=0.035; M1 v.s. OFC: T(7)=-1.90, p=0.098). This result is in agreement with a recent study using LC slice recordings from neurons labeled with retrograde tracers injected in the OFC, PL, ACC, and M1<sup>30</sup>.



**Extended Data Figure 8. Histology illustrating an electrode track and the LC.** A. Nissl stain in a coronal section (50  $\mu$ m thickness) shows the electrode track made by the 15  $\mu$ m thick probe within the coronal plane (arrows). Although accurate

reconstruction of the electrode (15 µm thickness in the coronal plane) oriented in 50 µm thick coronal sections was difficult, the 15 degrees posterior angle of electrode insertion allowed visualization of the track dorsal to the LC traveling through the coronal plane. The dotted lines indicate the approximate extent of the LC and MeV (LC – Locus Coeruleus, MeV - Mesencephalic Nucleus of the Fifth Cranial Nerve, V – Fourth Ventricle). A blood vessel (B) is noticeable lateral to the electrode track and dorsal to the MeV. B. A close-up on the LC shown in A showing the LC and a track ventral to LC and medial to a blood vessel. C. The next section after the section in A and B that was stained with DAB against an antibody for the catecholamine-synthesis enzyme, Tyrosine Hydroxylase. Note the electrode track that is ventral to LC and medial to a blood vessel.

Region	Ref.	Anterior/Posterior	Lateral	Ventral from dura	Angle (deg)
LC	Lambda	-4.0 to -4.2	1.1 to 1.2	5.5 to 6.2	15 posterior
PL	Bregma	+3.0	0.6	3.0	none
IL	Bregma	+3.0	0.6	4.4	none
ACC	Bregma	+1.0	1.2	2.2	4 lateral
DLO	Bregma	+4.0	3.0	2.4	none
M1	Bregma	+3.0	3.0	1.6	none
GI	Bregma	+1.0	5.0	4.0	none
<b>S</b> 1	Bregma	-1.0	5.0	1.8	none
S2	Bregma	-2.0	4.5	4.15	15 lateral
BLA	Bregma	-1.88 to -2.12	4.6 to 4.9	6.8	none
MDTh	Bregma	-3.0	1.0	5.0	2 lateral
Hb	Bregma	-3.0	1.0	4.5	2 lateral
VPMTh	Bregma	-3.0	3.0	5.6	none
DLGN	Bregma	-4.0	3.5	4.0	none
V2	Bregma	-5.0	4.8	1.2	none
V1	Bregma	-7.0	3.0	1.4	none

# Extended Data Table 1. A list of the stereotactic coordinates for electrode placement. All

coordinates are listed in millimeters.