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6	EM connectomics reveals axonal target variation in a sequence-generating network
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31 The sequential activation of neurons has been observed in various areas of the brain, but 32 in no case is the underlying network structure well understood. Here we examined the circuit anatomy of zebra finch HVC, a cortical region that generates sequences 33 underlying the temporal progression of the song. We combined serial block-face electron 34 35 microscopy with light microscopy to determine the cell types targeted by $HVC_{(RA)}$ neurons, which control song timing. Close to their soma, axons almost exclusively 36 targeted inhibitory interneurons, consistent with what had been found with electrical 37 recordings from pairs of cells. Conversely, far from the some the targets were mostly 38 other excitatory neurons, about half of these being other HVC_(RA) cells. Both observations 39 are consistent with the notion that the neural sequences that pace the song are 40 generated by global synaptic chains in HVC embedded within local inhibitory networks. 41

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43 INTRODUCTION

Neural sequences are central to many models of circuit function (Diesmann, Gewaltig et al. 44 45 1999, Jin, Ramazanoglu et al. 2007, Gibb, Gentner et al. 2009, Fiete, Senn et al. 2010, Mostafa and Indiveri 2014, Cannon, Kopell et al. 2015, Rajan, Harvey et al. 2016), and neurons often fire 46 sequentially during specific behaviors (Hahnloser, Kozhevnikov et al. 2002, Peters, Chen et al. 47 2014, Mello, Soares et al. 2015) or cognitive states (Pastalkova, Itskov et al. 2008, Harvey, 48 49 Coen et al. 2012), but the network properties that underlie such dynamics are poorly understood. Here we explore the synaptic connections within the zebra finch HVC, which is 50 central to generating the neuronal activity necessary to coordinate activation of vocal muscles 51 during the highly reproducible courtship song (Nottebohm, Stokes et al. 1976, Vu, Mazurek et 52 al. 1994, Aronov, Andalman et al. 2008, Long and Fee 2008). Song progression is paced by 53 HVC_(RA) neurons, which project to the primary downstream target area, known as the robust 54 55 nucleus of the arcopallium (RA) (**Figure 1a**). During the song, an HVC_(RA) neuron is either silent

or active in the form of a burst of action potentials that occurs at a single precise and cell-

specific time (Hahnloser, Kozhevnikov et al. 2002, Kozhevnikov and Fee 2007, Long, Jin et al.
2010, Vallentin and Long 2015). At any moment, it is estimated that about 200 of these 'pacer'
neurons are active and can drive the appropriate motor activity (Fee, Kozhevnikov et al. 2004),
presumably through a set of specific synaptic connections in RA (Fee, Kozhevnikov et al. 2004,
Markowitz, Liberti et al. 2015, Lynch, Okubo et al. 2016, Picardo, Merel et al. 2016).

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It has been difficult to discriminate between different models of sequence generation in HVC, in 63 part because of the unknown connectivity within that nucleus. One class of models uses a 64 synaptic (or 'synfire') chain architecture (Amari 1972, Abeles 1991, Diesmann, Gewaltig et al. 65 1999), which can deliver highly reliable and precise timing but requires direct connections 66 67 between the pacer neurons (Li and Greenside 2006, Jin, Ramazanoglu et al. 2007, Long, Jin et 68 al. 2010, Cannon, Kopell et al. 2015). Such connections are, however, only rarely seen with paired intracellular recordings, which at the same time showed that HVC(RA) neurons are 69 connected with high probability (> 0.50) to nearby inhibitory interneurons (Mooney and Prather 70 71 2005, Kosche, Vallentin et al. 2015). This observation weakened the case for synfire chain-72 based sequence generation in HVC and sparked the development of alternative hypotheses that do not require direct connections between excitatory cells (Yildiz and Kiebel 2011, 73 74 Hamaguchi and Mooney 2012, Amador, Perl et al. 2013, Goldin, Alonso et al. 2013, Armstrong and Abarbanel 2016, Hamaguchi, Tanaka et al. 2016, Rajan, Harvey et al. 2016). There are, 75 however, a number of reasons paired recordings may fail to correctly estimate the connection 76 rate between excitatory cells, among them the severing of axons during slice preparation 77 (Stepanyants, Martinez et al. 2009) and an oversampling of closely spaced neurons (Jiang, 78 79 Shen et al. 2015). To avoid this bias, we used a structural approach combining anatomical 80 reconstructions of complete cells in light microscopy (LM) with high-throughput serial block-face electron microscopy (SBEM) (Denk and Horstmann 2004, Seung 2009). 81

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83 **RESULTS**

We used both LM and EM, because anatomically, synapses can only be identified 84 unambiguously in EM, but currently the size of the volume that can be studied by EM is limited 85 86 to several hundred microns in one dimension (Helmstaedter 2013). This size is too small to explore the full extent of HVC connectivity, given that axon collaterals of HVC neurons ramify 87 widely throughout the nucleus (e.g. Figure 1—figure supplement 2a), which is roughly 2000 x 88 500 x 500 µm³ in size (Nixdorf-Bergweiler and Bischof 2007). We therefore used LM to explore 89 the mesoscale structure of the axonal morphology and EM to analyze synaptic connectivity. To 90 identify HVC(RA) cells, we injected markers into RA that are retrogradely transported, fluorescent 91 Tetramethylrhodamine (TMR, also called fluoro-Ruby) or biotinylated dextran (BDA, Figure 1-92 93 figure supplement 1), for tissue to be observed in LM or EM, respectively.

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To enable the LM-based reconstruction of the entire dendrite and of the axonal collaterals within 95 HVC for single HVC_(RA) cells, we used *in vivo* two-photon microscopy to target (Komai, Denk et 96 97 al. 2006) TMR-labeled somata for Neurobiotin labeling (Figure 1b). We eliminated all cells (29 98 of 44) where the labeling intensity varied between different parts of the neurite or where no descending axon could be found. The remaining 15 cells were imaged at 92 x 92 x 500 nm³ 99 100 voxel size using a transmitted light brightfield microscope (Oberlaender, Bruno et al. 2007) and reconstructed using Neuromorph (see Methods) (Figure 1c,d, Figure 1—figure supplement 101 **1a-e; Video 1).** In agreement with other observations (Dutar, Vu et al. 1998, Mooney 2000, 102 Kosche, Vallentin et al. 2015), we found that HVC_(RA) dendrites were compact, with 95.0 \pm 2.0% 103 104 (SEM) of the dendritic path found within 100 µm of the soma (Figure 1e). In contrast, the axon 105 collaterals, which were lined with synaptic boutons throughout (Figure 1-figure supplement **2b**), ramified across HVC. For each cell (n = 15), the dendrite was entirely (100%) confined to 106

HVC, while the axon (with the exception of the branch projecting to RA) was also largely
 restricted to the boundaries of HVC (97% on average).

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110 To quantify the prevalence of different types of synaptic inputs onto the dendrite of HVC(RA) cells, we next acquired a SBEM data set (166 x 166 x 77 µm³ overall size, comprising 15104 x 111 15104 x 2661 voxels, each 11 x 11 x 29 nm³ in size) from the central part of HVC (Figure 1f, 112 Figure 1—figure supplement 1f-j, Videos 2 and 3). All raw data as well as skeletonized 113 reconstructions are available online (Kornfeld 2017) (https://github.com/jmrk84/HVC paper). 114 Within this volume, 34 somata were positively identified as HVC_(RA) neurons by the presence of 115 a BDA-derived electron density (**Figure 1f**). This number is approximately 14% of the expected 116 value of HVC_(RA) somata (240 ± 28, SEM), given that there are about 40,000 ± 3,800 (SEM) 117 118 $HVC_{(RA)}$ cells (Wang, Hurley et al. 2002) and the total HVC volume is 0.35 ± 0.024 mm³ (n=14, 119 SEM). For 12 of the 34 labeled HVC_(RA) neurons, we manually reconstructed (skeletonized) (Helmstaedter, Briggman et al. 2011) the dendrite as far as possible. These reconstructions 120 ranged in dendritic path length from 642 μ m to 1956 μ m (1290 ± 469 μ m, mean ± SD) 121 122 compared with complete LM-based reconstructions (1438 µm to 4819 µm, mean ± SD: 3187 ± 997 µm). Although ~70% (174 out of 248) of dendritic branches reached the boundary of the EM 123 data set and were thus incomplete, 74 branches were completely reconstructed, including their 124 125 most distal inputs (median ± SD of maximum soma distances: 90.9 ± 8.6 µm and 116.7 ± 29.4 for EM and LM, respectively). Our reconstructions therefore sample the full gamut of input 126 types. While we do not find any variation of the input type with dendritic distance from the soma 127 beyond a distance of 40 microns (see below), it cannot be completely ruled out that a subtle 128 129 bias exists that lies below our detection threshold but might be discoverable when using larger 130 data volumes.

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132 We started by classifying for one cell all (1,003) incoming synapses (**Figure 1g-h**) by visually 133 inspecting their ultrastructural details (Gray 1959, Colonnier 1968) (Video 4 and 5). We found 134 that 396 (39.5%) synapses were asymmetric and thus presumably excitatory, and 607 (60.5%) were symmetric (inhibitory) cases. If it was not possible to classify a synapse based on its 135 136 inspection directly, additional synapses nearby on the same axon were analyzed, since it can be assumed that they are of the same type (Eccles 1976) (Figure 1-figure supplement 3). Our 137 synapse classification is reliable: in 19 out of 20 randomly selected test cases, a 2nd expert 138 independently came to the same conclusion and in another set of test cases (8 HVC_(RA), 11 139 HVC_(X), and 31 interneuron synapses), where the neuron type was known based on somatic and 140 dendritic morphology (Figure 2d, Figure 2 – figure supplement 1), all synapses were correctly 141 classified by an expert unaware of the cell type. 142

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The dominance of inhibitory synaptic inputs was consistently observed for HVC(RA) cells: when 144 we applied our synapse classification procedure to 97 short dendritic stretches (first and third 145 guartile of stretch length: 13.3 µm and 21.6 µm) randomly selected from 8 of the other 146 147 skeletonized HVC_(RA) cells, we found that across neurons the average ratio between excitatory 148 and inhibitory synapses was statistically indistinguishable (p = 0.36, one-way ANOVA) from that 149 found in the completely analyzed neuron. Inhibitory synapses were significantly enriched near 150 the soma (68 \pm 4% of all synapses at most 40 μ m from the soma are inhibitory compared to 57 \pm 2%, for synapses beyond that distance, mean \pm SEM, p < 0.05, Wilcoxon rank-sum test, 151 Figure 1i), an observation also made in cortical neurons (Anderson, Douglas et al. 1994). To 152 estimate the number of excitatory and inhibitory synapses that a single $HVC_{(RA)}$ neuron receives 153 154 on average, we first calculated dendritic synapse densities for all 9 analyzed cells separately for asymmetric (0.25 \pm 0.02 μ m⁻¹, mean \pm SEM) and for symmetric synapses (0.36 \pm 0.02 μ m⁻¹). To 155 get expected counts per cell, we multiplied these with the full dendritic path length (on average 156 3.2 mm per neuron), determined from LM reconstructions. Thus, on average well above half of 157

all synapses onto $HVC_{(RA)}$ dendrites are symmetric (59%, 1144 ± 429, mean ± SD) and only 41% are asymmetric (786 ± 311) — a surprising dominance of inhibitory inputs that stands in stark contrast to mammalian cortical neurons (Beaulieu, Kisvarday et al. 1992, Peters 2002, Kasthuri, Hayworth et al. 2015), where the inhibitory synapses are typically found to be at most 20% of the total.

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We next inspected all BDA-labeled dendrites emerging from the 12 aforementioned cells for 164 synapses in which the presynaptic axon was labeled, and thus had to come from other HVC(RA) 165 cells (Figure 1j). We found 44 such homotypic synapses between HVC_(RA) cells (see Methods), 166 but they comprise only about 1% among an estimated total of 3.817 ± 926 (SD) incoming 167 excitatory synapses. Their median size $(0.21 \,\mu\text{m}^2)$ and size variation (first and third quartile: 168 169 0.10 μ m² and 0.48 μ m²), were statistically indistinguishable from those for all asymmetric synapses (0.17 μ m²; first and third quartile: 0.08 μ m² and 0.39 μ m², p > 0.05, Wilcoxon rank-170 sum test, Figure 1k). One might be tempted to consider the small number of double-labeled 171 synapses as evidence that HVC_(RA)-HVC_(RA) connections are rare. However, BDA labeled only a 172 small fraction (1/7th) of all HVC_(RA) cells in our data set (Figure 1—figure supplement 4a) and 173 even for those, axonal collaterals were often incompletely filled (Figure 1-figure supplement 174 **4b**), suggesting the probability that a given stretch of $HVC_{(RA)}$ axon is labeled could be quite 175 small. To estimate this probability, we created a 300-member set of 1 μ m³ cubes randomly 176 placed throughout the SBEM volume and measured the total labeled axonal path length they 177 contained. The value obtained (38.6 µm of labeled axon across 300 cubes) is about 13 times 178 smaller than that expected given an estimate of the combined axonal path length (585.6 m) of 179 all 40,000 HVC_(RA) cells. The axonal labeling probability of 7.6 ± 1.6% (SEM, see Methods) in 180 181 turn implies that the homotypic HVC_(RA) synapses constitute ~15 \pm 4% (SEM) of all excitatory 182 synapses onto HVC_(RA) neurons.

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We next took a presynaptic perspective to independently estimate the extent of HVC(RA)-HVC(RA) 184 185 connectivity and used a transsynaptic tracing scheme (McGuire, Gilbert et al. 1991) to determine the cell-type of the targets of the outgoing synapses on BDA-labeled axon collaterals 186 (Figure 2a). The three main cell types found in HVC (Dutar, Vu et al. 1998, Kubota and 187 188 Taniguchi 1998, Mooney 2000) are easily distinguished in LM: Inhibitory interneurons have smooth dendrites with a nearly complete lack of spines (Mooney 2000, Wild, Williams et al. 189 190 2005), and excitatory neurons project to either RA or to the basal ganglia (Area X), with the descending axon clearly recognizable. Even short stretches of dendrite can be reliably ascribed 191 to one of the three types, because the spine density varies widely between but not within them 192 (Dutar, Vu et al. 1998, Kubota and Taniguchi 1998, Mooney 2000) (Figure 2b,c). Dendrites 193 were largely aspinous (0.01 \pm 0.01 spines/ μ m, mean \pm SD) for interneurons, densely covered 194 195 with spines (0.70 ± 0.13 spines/ μ m) for HVC_(X) cells and less so (0.21 ± 0.07 spines/ μ m) for HVC(RA) neurons. This spine density metric correctly classified 17 out of 18 BDA-labeled HVC(RA) 196 197 dendrites in EM as well as 11 inhibitory neurons that had been classified using other morphological characteristics (symmetric synapses and a large soma diameter, Figure 2-198 199 figure supplement 1a). We used this to classify the cell type of postsynaptic dendritic 200 segments (n = 528) transsynaptically traced from 9 BDA-labeled axons fully reconstructed in the EM volume. In 41 of 569 cases, the cell type could not be determined. These cases were 201 202 excluded from further analysis, because the ultrastructure was obstructed by the BDA label (n = 33) or because the recovered dendritic branch was too short (n = 8), see Methods, Figure 2d. 203 204

When we examined three BDA-stained axons that each emerged from labeled somata in the SBEM dataset (path lengths: 1.37, 0.88, and 0.72 mm), we found that of 121 connections, 115 terminated on dendrites of inhibitory cells but only 6 onto excitatory cells, 4 of which being other $HVC_{(RA)}$ cells (e.g., **Figure 2e**). This agrees with the high connectivity found for closely spaced $HVC_{(RA)}$ -interneuron pairs by electrical recordings (Kosche, Vallentin et al. 2015) as well as with reports using EM connectomics for other cortical tissue (Bock, Lee et al. 2011). However, at this density, there would only be about 20 homotypic synapses per $HVC_{(RA)}$ neuron, which is about 6 times smaller than our estimate derived from the BDA-labeled inputs onto $HVC_{(RA)}$ dendrites.

214 We then examined BDA-labeled axon fragments that were 'orphaned' (n=6, path length: 0.56 ± 0.27 mm, mean \pm SD), i.e., could not be traced back to their soma and were therefore likely 215 farther away from it. Three of the fragments were synaptically connected to one of the labeled 216 dendrites and four were partially myelinated. We discovered that the prevalence of synapses 217 218 onto excitatory neurons, and onto other HVC(RA) cells in particular, was much larger for orphaned fragments than for attached axons; increases were 13-fold (HVC_(RA)-E), from 5.0% (6 219 out of 121) to 64.6% (263 out of 407), and 11-fold (HVC_(RA)-HVC_(RA)), from 3.3% (4 out of 121) to 220 221 36.8% (150 out of 407) (Figure 3a). HVC_(RA) dendrites were often connected by more than one 222 synapse to a labeled axon (17 doubles, 3 triple, and 1 guintuple among 127 analyzed pairs). The much larger (compared to the proximal outputs) fraction of excitatory target cells for the 223 orphans implies that the prevalence of the different target types must depend on the distance 224 225 from the soma. This would also be consistent with the low connection probability of 0.7% 226 between $HVC_{(RA)}$ cells found in electrophysiological recordings (Kosche, Vallentin et al. 2015), where the recorded somata are usually less than 200 µm apart (Mooney and Prather 2005, 227 Jiang, Shen et al. 2015), while, as our LM reconstructions show, $56 \pm 14\%$ (SD) of the axon 228 229 collaterals' path lies farther than 200 µm from the soma, with some of them ramifying over the extent of HVC (e.g., Figure 1-figure supplement 2a). 230

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Can we estimate the distance of an orphan segment to its soma based on local information? It is apparent from our LM reconstructions that branching becomes less frequent as the distance from the soma increases (**Figure 3 b,c**). Consistent with this, $HVC_{(RA)}$ axons in the SBEM data set that were connected to a cell body were much more highly branched (12.4 ± 3.7, mean ±

236 SD, branch points/mm, **Figure 2e**) than most orphaned axon fragments, with an average of only 237 4.0 ± 4.3 (mean \pm SD) branch points/mm. To obtain a quantitative estimate of the distance to the soma and its uncertainty based on the number of branch nodes on a branch and its length 238 we used both a nearest neighbor (Figure 3 d-g) and a Bayesian (Figure 3—figure 239 240 supplement 1) analysis (for details see Methods). We found that a synapse was much more likely to be connected to another $HVC_{(RA)}$ cell or to a $HVC_{(X)}$ neuron rather than to an inhibitory 241 neuron if the synapse was farther away from the soma (Figure 3d). The transitions between 242 these regimes may well be gradual: One of the orphaned axons (Figure 3—figure supplement 243 2) showed an unusually high branch density (11.4 branch points/mm), suggesting a location 244 close to the soma (16th to 84th percentile: 35.8 to 72.3 µm and also made the majority of its 245 connections (52 of 83, 63%) onto interneurons, twice the fraction seen for the other orphaned 246 247 axons $(32\% \pm 10\%, \text{mean} \pm \text{SD})$.

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To rule out the possibility that our findings are due to a selection bias, we estimated the fraction 249 of homotypic synapses for the 59 BDA-labeled axon fragments found in the 300-member set 250 251 (see above), tracing each fragment from the sampling cube until we found two synapses or reached the data set boundary, and determined the postsynaptic cell types. Out of 105 252 synapses, 65 targeted interneurons, 22 HVC_(X) neurons, and 18 other HVC_(RA) neurons. Since 253 254 there are approximately 1111 \pm 513 (SD) outgoing synapses inside HVC for each HVC_(RA) neuron (given an axon path length of 14.7 mm and a total synapse density of 75.4 255 synapses/mm), we expect about \sim 191 ± 88 (SD) homotypic synapses per cell (on average, 256 incoming and outgoing homotypic synapse have to be equal in number), comprising about a 257 quarter ($24 \pm 4\%$, SEM) of all incoming excitatory synapses, and nearly half of all outgoing 258 259 excitatory contacts. The discrepancy between the estimates of the homotypic fraction of incoming excitatory synapses from the dendritic (~15 %) and axonal perspective (~24 %) might 260

be due to the fact that when counting the number of double labeled synapses, we accepted only
 those where the labeling of the presynaptic terminal was unambiguous.

263

How can we be sure that all or at least most of the orphaned fragments belong to $HVC_{(RA)}$ 264 265 neurons? Since BDA (which is transported in the retrograde direction much more efficiently than anterogradely in all tissues tested, including the zebra finch brain (Reiner, Veenman et al. 2000) 266 was only injected into RA, any labeled axon has to belong to a cell with an axon that connects 267 HVC and RA, as HVC_(RA) axons do. If there is indeed a substantial number of cells in RA that 268 project to HVC(Roberts, Klein et al. 2008), then it is possible that a substantial fraction of the 269 orphaned axons could originate from those cells. To independently confirm the number of 270 RA(HVC) cells, we injected the fluorescent tracer Dil (Invitrogen) into HVC, which heavily labeled 271 272 the upstream nuclei NIf and Uva (Figure 3-figure supplement 3) but yielded only a small 273 number of labeled somata in RA (125, 163, and 171, respectively, in three birds), approximately one for every 200 HVC(RA) neurons on average. To account for the density of labeled axon in 274 our EM volume, each those cells would need a total axon path of ~4 m in HVC, which appears 275 unlikely given that the extensively ramifying HVC_(RA) axons have a length of only ~0.015 m. 276

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278 DISCUSSION

We have shown that the synaptic architecture in HVC contains a density of connections between $HVC_{(RA)}$ neurons that might be sufficient to support a synaptic-chain model, whereby precisely timed sequences of action potential bursts in $HVC_{(RA)}$ neurons are generated by a wave of activity propagating via synaptic connections among these neurons without the need for inhibition-mediated propagation of activity (Yildiz and Kiebel 2011) or to involve structures outside HVC (Hamaguchi and Mooney 2012, Goldin, Alonso et al. 2013, Hamaguchi, Tanaka et al. 2016).

286 While we estimate that 25% of excitatory inputs to $HVC_{(RA)}$ neurons are homotypic, the sources 287 of the remaining synapses are unknown. It should be a central goal of future efforts to quantify the relative number of connections from these regions (e.g., Uva, NIf, etc.) at the level of single 288 $HVC_{(RA)}$ neurons. That said, many of these connections, such as auditory afferents (Vallentin 289 290 and Long 2015), collaterals from HVC_(X) neurons (Scharff, Kirn et al. 2000), and descending fibers from NIf are unlikely to play a role in motor patterning, since removal of NIf does not 291 disrupt the song (Cardin, Raksin et al. 2005). The precise role of Uva, a thalamic region also 292 directly projecting to HVC (Nottebohm, Kelley et al. 1982), remains to be determined (Coleman 293 294 and Vu 2005, Hamaguchi, Tanaka et al. 2016).

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Somewhat surprisingly, the low rates of pairwise connectivity seen in electrophysiological 296 297 recordings (Mooney and Prather 2005, Kosche, Vallentin et al. 2015), which previously had 298 been interpreted as evidence against a direct synaptic chain (Armstrong and Abarbanel 2016). are not inconsistent with our estimate that each HVC(RA) neuron receives a significant amount of 299 its excitatory input from other HVC_(RA) neurons. The reason is that with the around 200 300 301 homotypic inputs per cell, the probability to be connected to any one of around 40,000 HVC_(RA) 302 neurons can be at most 0.5%. The question remains what fraction of those inputs are true 303 'chain' synapses in that the presynaptic cell's activity immediately precedes that of the 304 postsynaptic cell, but our study demonstrates that the anatomical substrate for the chain model 305 exists.

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An important next step will be to combine functional imaging with volume EM to directly test whether an $HVC_{(RA)}$ cell receives more numerous or stronger direct homotypic inputs from cells that fire immediately prior to its own activity. In fact, a recent study describes how calcium activity can be imaged in the singing bird (Picardo, Merel et al. 2016), a crucial step in that direction. One potential difficulty stems from our finding that $HVC_{(RA)}$ neurons preferentially form distal connections, indicating that the timing circuitry in HVC is distributed and therefore requires a large EM volume (as much as 500 million μ m³, compared to 2 million μ m³ in our volume) for its complete reconstruction. It might take the better part of a year merely to acquire the raw data (Schalek, Lee et al. 2016). While even a few years ago it seemed impossible to analyze such an amount of data within a reasonable time frame, recent progress in the automation of segmentation are encouraging (Berning, Boergens et al. 2015, Januszewski, Maitin-Shepard et al. 2016, Beier, Pape et al. 2017, Dorkenwald, Schubert et al. 2017).

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Our finding that connections near the soma are often onto inhibitory neurons suggests that 320 inhibition plays an important role in sequence generation, which is further supported by the large 321 overall fraction of inhibitory inputs. One function of those inhibitory connections could be to 322 323 decorrelate excitatory activity in space and time: Not only are nearby $HVC_{(RA)}$ neurons rarely 324 connected and thus unable to drive each other, but even when driven by a common input, only the cell(s) with the strongest input(s) will continue to fire in the face of the winner-take-all effect 325 due to the strong reciprocal inhibition (**Figure 3h**). Winner-take-all behavior is normally 326 327 associated with certain cognitive tasks (Hopfield and Tank 1985, Lundqvist, Rose et al. 2016), 328 such as decision making (Usher and McClelland 2001). In HVC, it may help to prevent local clusters of activity, which could lead to leakage across different chains passing through adjacent 329 330 excitatory neurons. An altogether different role for local inhibition may be the improvement of temporal precision by sharpening burst timing through recurrent inhibition (Hahnloser, 331 Kozhevnikov et al. 2002, Long, Jin et al. 2010, Cannon, Kopell et al. 2015). 332 333 Inhibition may, furthermore, have a central role in shaping the distance dependency of 334 335 postsynaptic targets during circuit development without the need for molecular cues (de Wit and

Ghosh 2016). Instead, the architecture we observed may arise naturally from a pattern that

initially follows Peters' rule (Braitenberg and Schüz 1998), which predicts synaptic connections

338 between cell types with intermingled axonal and dendritic arbors (Rees, Moradi et al. 2017), but 339 is then refined as the interneurons increasingly prevent the co-activation of nearby excitatory cells, thereby destabilizing connections between them while leaving more distant connections 340 intact. Such a preferentially distal connectivity would also favor more widely distributed synaptic 341 342 chains, which could have the added benefit of relying more on axonal propagation delays for sequence timing (Budd, Kovacs et al. 2010). Overall, the observed synaptic architecture shows 343 some resemblance with local inhibitory/excitatory networks linked by long-range 344 excitatory/excitatory connections (coupled winner-take-all modules) that have been shown to 345 make computational models of cortical sequence generation more robust (Binas, Rutishauser et 346 al. 2014, Mostafa and Indiveri 2014). 347

348 MATERIALS AND METHODS

349 Animals

We used adult (>90 days post hatch) male zebra finches that were obtained from an outside breeder and maintained in a temperature- and humidity-controlled environment with a 12/12 hours light/dark schedule. All animal maintenance and experimental procedures were performed according to the guidelines established by the Institutional Animal Care and Use Committee at the New York University Langone Medical Center.

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356 Surgery

To label only neurons that projected from HVC to the robust nucleus of the arcopallium (RA), we

injected lysine-fixable retrograde dextran tracers (Invitrogen) conjugated to either

Tetramethylrhodamine (fluoro-Ruby, mol. Weight: 10,000) or biotin (BDA, mol. weight: 3,000) for

360 preparations to be inspected with light microscopy (LM) or electron microscopy (EM),

respectively. We injected 200 nL of either Fluoro-Ruby (50 mg/mL) or BDA (100 mg/mL) into RA

of anesthetized (1-3% isoflurane in oxygen) zebra finches using an injection system (Nanoject,

363 Drummond Scientific) outfitted with a glass injection pipette (tip diameter: 30-40 μm). RA was

targeted using stereotaxic coordinates (2.30 mm lateral and 1.85 mm posterior from the
midsagittal sinus) and success in finding the RA region was confirmed by observing
characteristic spontaneous activity (Long and Fee 2008) using a carbon-fiber electrode
(Carbostar-1, Kation Scientific) and an extracellular amplifier (NPI Electronic Instruments).

For *in vivo* imaging and dye loading, we first had to enable optical access to HVC. To 369 accomplish this, a craniotomy (1 mm x 1 mm) was prepared over HVC. The underlying dura 370 was then carefully removed with a flame sharpened tungsten wire (starting diameter: 0.5 mm). A 371 small drop of saline buffer was applied to the exposed brain, followed by a 3 mm-diameter 372 round cover glass (#0 thickness, Warner Instruments) as an optical window, which was first 373 secured to the surrounding skull by applying light-curable acrylic (Flow-IT ALC; Pentron Clinical 374 375 Technologies) around the edges of the glass. Dental acrylic (Cooralite Dental MFG) and 376 cyanoacrylate were then added to permanently and stably attach the cover glass to the skull. A small metal head plate with two tapped holes was then implanted at the anterior part of the skull 377 using dental acrylic for head fixation. 378

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380 **2-Photon Guided Cell Labeling**

Juxtacellular labeling (Pinault 1996, Narayanan, Egger et al. 2015) with Neurobiotin (Vector 381 382 Labs) was used to fill individual RA-projecting HVC (HVC(RA)) neurons out of a population that had been retrogradely labeled from RA with fluoro-Ruby in vivo. After waiting at least 48 hours 383 following the injection of the retrograde tracer into RA, two-photon imaging (Denk and Webb 384 1990) was used to identify the target cell and guide the pipette. On the day of single-cell 385 labeling, a small pipette access hole (~400-500 µm) was drilled in the glass coverslip 386 387 immediately lateral to the target recording region using a carbide bur drill bit (1/4 FG-100; 388 Johnson-Promident). Glass pipettes were fabricated using a horizontal puller (P97, Sutter Instrument Company) and had a final resistance of 4-5 M Ω when loaded with internal solution 389

390 that consisted of 150mM K-Gluconate (Sigma) and 3% Neurobiotin. The microscope (MOM, 391 Sutter Instrument Company) was of the moveable objective design (Euler, Hausselt et al. 2009) and was controlled using ScanImage (Pologruto, Sabatini et al. 2003) 3.8 with a 16x/0.8 NA 392 water immersion objective (Nikon). Pipettes were made fluorescent either by adding 40 µM of 393 394 Alexa 488 (Invitrogen) to the internal solution or by coating the pipette with green fluorescent guantum dots (Andrasfalvy, Galinanes et al. 2014). The activity of HVC_(RA) neurons was 395 recorded (IR-183, Cygnus Technology Inc), and cells were filled with Neurobiotin by applying 396 1000-1500 positive current pulses with an amplitude between 3 and 15 nA and a duration of 200 397 ms delivered at a frequency of 2.5 Hz. 398

399

400 Histological Procedures (LM)

401 Birds were anesthetized with pentobarbital sodium and perfused transcardially with 4% w/v 402 paraformaldehyde (EMS) at least one hour after dye loading to permit adequate Neurobiotin diffusion. Brains were removed from the skull using a surgical scoop, immersed in 4% 403 paraformaldehyde for 3-5 days to achieve thorough fixation, and incubated in phosphate buffer 404 405 for an additional 1-3 days to decrease endogenous peroxidase activity. To prepare sections, the brain was cut across the midline, mounted on the sagittal surface with cyanoacrylate, and 406 stabilized with 3% agarose. Parasagittal sections (100 µm thickness) of HVC were cut using a 407 408 vibratome (Leica VT1000S). Slices were washed five times with phosphate buffer and treated with 3% H₂O₂ to further reduce endogenous peroxidase activity. Slices were then immersed 409 overnight at 4°C in a solution containing avidin/biotin complexes and 0.5% Triton X-100 in 410 phosphate buffer (Vector Labs and Sigma, respectively) to tag the Neurobiotin with peroxidase 411 complex. On the following day, slices were washed 5 times with phosphate buffer and then 412 413 immersed in a solution containing 2.3 mM diaminobenzidine (DAB, Sigma) and 0.01% H₂O₂ in 414 phosphate buffer to label processes containing Neurobiotin. Slices were then washed and mounted on slides with Vectashield (Vector Labs) or Mowiol (Sigma-Aldrich) mounting medium. 415

416

417 To quantify the number of HVC-projecting RA neurons, we injected a retrograde tracer into HVC (Dil, Invitrogen D3911; 46 nL total injection volume) that labels neurons with high efficiency in 418 zebra finches (Scott, Gardner et al. 2012). Following a two-day incubation period, animals were 419 420 perfused with 4% paraformaldehyde, and 100 µm sagittal sections were cut across the entirety of RA, Nucleus Interfacialis (NIf), and nucleus Uvaeformis (Uva). Sections were mounted on 421 slides using Vectashield (Vector Labs) and imaged with a confocal microscope (LSM 800, 422 Zeiss; excitation / emission: 551 / 569 nm) using a 20x objective (0.8 NA). The z-stacks of 423 retrogradely labeled RA(HVC) neurons were captured across the extent of RA, and the position of 424 each cell was manually marked using the landmark function in Amira. 425

426

427 LM Imaging

428 Only well-filled HVC_(RA) neurons were selected for reconstruction, specifically those in which the soma, dendrite, and axon were all labeled (even if faintly) without interruptions and with clearly 429 labeled dendritic spines and presynaptic boutons were selected for high resolution LM imaging 430 with a custom-designed high-resolution mosaic/optical-sectioning brightfield microscope system 431 (Oberlaender, Bruno et al. 2007). In brief, a transmitted light brightfield microscope (Olympus 432 BX51, Olympus, Japan), equipped with a motorized x-y-z stage (Maerzhaeuser, Wetzlar, 433 434 Germany), a narrow bandpass (546 ± 5 nm) illumination filter and a 100x magnification oilimmersion objective (numerical aperture 1.4) was used to acquire image stacks from 435 consecutive 100 µm thick brain sections. For each section, a 3D mosaic of images (e.g., 10 x 15 436 fields of view) covering the entire HVC was acquired at 92 x 92 nm pixel size and in steps of 437 500 nm mechanical defocus. Next we applied a linear image restoration algorithm (Tikhonow-438 439 Miller) using the Huygens software package (Scientific Volume Imaging, Netherlands). By 440 inverting the gray values of the brightfield image stacks they could be treated as fluorescent data with an emission wavelength of 546 nm. The deconvolution used a point-spread-function 441

that takes the optical properties of biocytin-labeled brain tissue into account (Oberlaender,

443 Broser et al. 2009). Deconvolved image stacks were then downsampled by a factor of 2 in x/y,

444 yielding a final voxel size of 184 x 184 x 500 nm before axonal reconstruction. To quantify the

bouton density, subvolumes that contained primarily horizontal (i.e. within the image plane)

446 axonal branches were acquired at 200 nm focus increments and used without deconvolution.

447

445

448 **Neuron reconstructions (LM)**

Neuronal branches (dendrites and axons) were reconstructed in 3D using NeuroMorph 449 (Oberlaender, Bruno et al. 2007). Automated tracing results from each histological section were 450 manually proof-edited using FilamentEditor (Dercksen, Hege et al. 2014), custom-designed 451 based on Amira visualization software (FEI-VisualizationSciencesGroup). In brief, maximum-452 453 intensity z-projections of the original image stacks were superimposed onto automatically 454 generated 3D skeleton tracings of all putative neuronal branches contained within the imaged volume and segmented objects that had no correspondence in the projection image were 455 manually deleted (Dercksen, Hege et al. 2014). Fragmented segments were spliced, and axonal 456 branches were classified as 'dendrite' or 'axon' based on whether, respectively, spines or 457 458 boutons were visible in the projection images. Whenever a neuronal branch reached one of the borders of the imaged volume, additional image stack regions were acquired that allowed us to 459 460 follow the branch further. To account for shrinkage during histological processing, the reconstruction was scaled to match the thickness of 100 µm, as defined by the vibratome. The 461 scaled 3D tracings from all consecutive sections were then combined and manually aligned 462 using the FilamentEditor. The z-coordinate of each point was then replaced by the average of 9 463 points (the point itself and the 4 adjacent points in each direction) and resampled to a point 464 spacing of about 1 µm. Smoothing in z and downsampling make path length measurements 465 466 comparable to manual tracing results using Neurolucida Software (Microbrightfield). The NeuroMorph and FilamentEditor tools enable tracings that are independent of the experience of 467

the human operator, with an interuser-variability of approximately 20 μm per 1 mm axonal
length(Dercksen, Hege et al. 2014). The borders of HVC were manually traced in each 100 μm
tissue section using Neurolucida.

471

472 Analysis of LM reconstructions

The fraction of dendritic length contained within a certain distance of the soma was determined 473 by conducting a spherical Sholl analysis (Sholl 1953) in Neurolucida (MBL sciences). The 474 proportion of axonal pathlength both within HVC and within a 200 µm radius from the soma was 475 computed in Amira for each neuron using the ZIB extension package (Egger, Dercksen et al. 476 2014). Axonal boutons and dendritic spines were annotated manually in Amira using high-477 resolution LM stacks. The location of each bouton or spine was marked in 3D and aligned in 478 479 Amira to the corresponding branch reconstruction. Spine-densities were calculated for each 480 branch by dividing its total spine count by its path length. Branch nodes (points where the axon bifurcates) were manually located in the reconstructions using Amira. Branch nodes for which 481 one of the daughter branches was $< 15 \,\mu m$ in length were not included in this analysis. 482

483

484 **Histological Procedures (EM)**

The bird used for the EM experiments was transcardially perfused in a way that preserves the 485 486 extracellular space and leads to minimal shrinkage (JK, unpublished observations), by using high pressure and the following fixative solution: 0.07 M sodium cacodylate (Serva), 140 M 487 sucrose (Sigma), 2 mM CaCl₂ (Sigma) with 2% paraformaldehyde and 2% glutaraldehyde 488 (Serva) added (Cragg 1980). The brain was removed and, using a vibratome (Leica VT1000S), 489 cut into slices each about 200 µm thick. One of the slabs that centrally intersected HVC was 490 491 selected and post-fixed in the same solution overnight, rinsed several times with cacodylate 492 buffer and permeabilized in a 30% sucrose solution by exposing it to one freeze-thaw cycle in liquid nitrogen. Residual peroxidase activity was suppressed by soaking the sample in 3% H₂O₂ 493

494 for 30 minutes before labeling the sample with an avidin-peroxidase complex and DAB, as described in a previous section. The sample was then rinsed several times in cacodylate buffer. 495 Heavy metal staining was added through a conventional ROTO protocol using the following 496 steps interspersed with rinses in cacodylate buffer (after first Osmium step) or H₂O (all others): 497 498 2% OsO₄ (Serva), reduced with 2.5 % potassium hexacyanoferrate(II) (Sigma) 2 h, room temperature; 1% thiocarbohydrazide in H₂O, 1 h, 58 °C (Sigma); 2 % OsO₄, 2 h; 1.5 % uranyl-499 acetate in H₂O, 53°C (Serva); 20 mM lead-aspartate, 2 h, 53°C (Sigma) (Seligman, Wasserkrug 500 et al. 1966, Karnovsky 1971, Walton 1979). Dehydration was performed using an ethanol series 501 with 10, 15, 10, 10 minutes at 70%, 100%, 100%, and 100% ethanol (Electron Microscopy 502 Sciences). The sample was infiltrated with epoxy monomer (epon hard, Serva) (Glauert and 503 Lewis 2014) dissolved in propylene oxide (Sigma) for 3 h and for 3 h with pure monomer before 504 505 final embedding and curing (48 h at 60°C). The sample was then trimmed and glued with epoxy 506 to a custom-made aluminum holder and trimmed into a pyramidal-shape before gold coating for better conductivity. 507

508

509 SBEM Imaging and data preprocessing

510 We performed serial block-face electron microscopy (Denk and Horstmann 2004) at 11 × 11 × 29 nm voxel size using a scanning electron microscope with a field-emission cathode (UltraPlus, 511 512 Zeiss, Oberkochen, Germany) equipped with a custom-built in-chamber microtome in highvacuum (raw and effective voxel rates were 5 and 2.1 MHz respectively) at a dose of 10.3 513 electrons/nm², 2 kV landing energy with a custom back-scatter electron detector and 514 amplification system optimized for fast acquisition speeds. Before each cut, a subregion of the 515 block face was imaged using four overlapping micrographs resulting in an image stack. Images 516 517 were registered by affine transformations (<u>https://github.com/billkarsh/Alignment_Projects</u>) (Scheffer, Karsh et al. 2013, Karsh 2016) and converted to a KNOSSOS (www.knossostool.org) 518

- data set for reconstruction and browsing with custom Python code (<u>https://github.com/knossos-</u>
 <u>project/knossos_python_tools/tree/master/knossos_cuber</u>) (Kornfeld 2017).
- 521

522 Neuron reconstructions (EM)

523 Each annotator received at least 10 hours of training and was considered an expert after one year of annotation experience. BDA-labeled neurons, using the soma as a starting place, were 524 skeletonized within the EM stack in KNOSSOS by an expert annotator, and errors were 525 corrected by the same individual in a second pass, which was also used for synapse annotation. 526 All BDA-labeled axons, including orphaned axons, were traced by at least two independent 527 annotators and discrepancies were resolved by an expert that had not participated in the initial 528 annotation. Synapses on each axon were then labeled (see synapse identification) and 529 530 proofread by an expert annotator who excluded cases where the BDA-label obscured the 531 ultrastructure. The remaining synapses were used to seed the tracing of the postsynaptic dendrite segment. Annotators were instructed to reconstruct the postsynaptic dendrite to the 532 end of the branch in one direction and to the next main branch point in the other direction. All 533 dendritic-branch tracings were proofread by an expert and only included if at least a minimum 534 535 path length of 10 µm could be reconstructed. All EM reconstructions were analyzed and visualized with custom Python code using the Mayavi2 (Enthought) library (Kornfeld 2017, 536 537 Kornfeld 2017).

538

539 EM synapse annotation

Synapses were labeled by an expert annotator and classified as symmetric or asymmetric
(Video 4 and 5, Figure 1—figure supplement 3). Active-zone 'diameters' were quantified by
measuring - with KNOSSOS - the cross-sectional length of the synaptic thickening in that plane
and principal viewing orientation (x, y, or z) in which the contact cross section appeared largest.
Diameters were then converted to areas by assuming a circular synaptic contact.

545

546 **Classification of postsynaptic cell type**

To estimate dendritic spine density, a stretch of the postsynaptic dendrite (> 10 μ m) was 547 selected that often included the place where the axon was in contact with the dendrite. We 548 549 counted as a spine every skeleton branch with a length greater than 1 µm that emerged from the dendritic shaft. Some postsynaptic protrusions found on interneurons contained multiple 550 synapses (e.g., Figure 2-figure supplement 1b). Therefore, spines were defined as receiving 551 no more than one synapse at their ends by three independent annotators. The resulting spine 552 density D_{spine} (in µm⁻¹) was used to classify the dendritic stretch as belonging to an interneuron 553 $(D_{spine} < 0.11)$, HVC_(RA) (0.11 < $D_{spine} < 0.46$), or HVC_(X) neuron (0.46 < D_{spine}). To detect dendritic 554 reconstructions that were traced from separate synapses but belonged to the same dendrite, we 555 detected overlap between skeletons using the following criterion: a node was considered to 556 557 overlap another skeleton if it was less the 400 nm from any edge of all other skeletons. Dendritic reconstructions were defined as belonging to the same neuron when at least 25% of their nodes 558 overlapped. Since the postsynaptic dendritic reconstructions were never complete (i.e. only 559 parts of the entire neuron could be reconstructed), our analysis could only positively identify 560 561 reconstructions as belonging to the same cell. For dendrites that were found to belong to the same cell (grouped together after being traced from different synapses), spine density was 562 563 averaged before classification.

564

565 Estimating the axon-to-soma distance

We used two different ways to estimate the distance between an orphaned branch and its soma from its number of branch nodes inside the EM volume, both based on the LM observation that the density of branch nodes, D_b, varies with soma distance (r) (**Figure 3c**). The first way used a Bayesian approach to calculate the probability distribution over r, given a branch of length / and

570 a branch-node count of N (Figure 3c), which can be used to estimate, as needed, mean, 571 median, variance or any quantile for r: 572 $P(r|N,l) \propto P(N,l|r) * P_a(r),$ 573 574 whereby 575 576 $P(N, l|r) = \frac{(D_b(r)*l)^N * e^{-D_b(r)*l}}{N!},$ 577 578 which assumes that the branch nodes are placed independently from each other and are, 579 therefore, Poisson distributed with a node-count expectation value of $\lambda = D_h(r) * l$. Fitting the 580 LM measurements to an exponential gave $D_b(r) = (35.448 * e^{-\frac{r}{43.5mm}} + 0.613)/\text{mm}$. The 581 582 Bayesian prior, $P_a(r)$, i.e. the probability that an axon segment is found at a distance between r 583 and $r\pm\Delta$ from its soma, was estimated by applying Gaussian kernel density estimation (Python scipy.stats.gaussian kde, scott bandwidth selector) to the LM based axon distribution 584 measurements. 585 586

The other way to relate r to N and I is to sample the LM data directly: We divided each of the 15 587 LM stacks into volumes shaped identically to the EM volume and recorded for each volume and 588 589 for all contained orphaned branches their lengths, distances from the soma, and branch-node 590 counts. Only branches that both entered and left the sampled subvolume were considered 591 (about 95% of the total) because all of the reconstructed orphaned branches in the EM volume also had that property. This was repeated with the origin of the division grid shifted in 10 µm 592 increments along all 3 axes resulting in 17 × 17 × 8 different divisions for each LM stack. For a 593 given orphaned branch in the EM volume, we selected all those sample branches that had the 594

same node count and a length within \pm 10%. The distribution of their soma distances was then used in the same way as the probability distribution coming from the Bayesian approach.

597

598 Estimating the fraction of homotypic HVC_(RA) synapses

In order to estimate the homotypic fraction of all excitatory synapses onto HVC(RA) cells, we 599 determined the density of homotypic synapses by counting the number of double labeled 600 synapses and correcting it for the axonal labeling efficiency. Labeling efficiency was estimated 601 by comparing the volume density of labeled axon length by inspecting 300 randomly placed 1 602 μm^3 cubes with the density expected for HVC_(RA) neurons using published estimates for their 603 total number (Wang, Hurley et al. 2002) and the average axonal path length from LM 604 reconstructions. To count the number of double labeled synapses, BDA-labeled dendrites were 605 606 searched by an expert annotator for synapses with labeled axons by following them in 607 KNOSSOS at the full voxel resolution, instructed to annotate also synapses with weak labeling. The found synapses were then scrutinized by JK and the result was confirmed by ML and SB. 608 609

610 All error estimates were calculated assuming independence of the errors using the variance 611 formula for error propagation.

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629

630 Figure Legends

631

632	Figure 1 Analysis of synaptic inputs onto HVC(RA) dendrites. (a) A schematic of the songbird
633	brain showing HVC and its two main downstream targets, RA and Area X. (b) A backlabeled
634	HVC _(RA) neuron (red) during juxtacellular filling (pipette shown in white) guided by 2-photon
635	imaging of fluoro-Ruby. (c , d) A Neurobiotin-filled cell from (b) in brightfield LM after
636	histochemical processing (c) and dendritic reconstruction (d). (e) Normalized count of dendritic
637	path length vs. soma distance for 15 $HVC_{(RA)}$ neurons; individual cells (gray) and average (red).
638	Bin size: $10\mu m$. (f) Cross-section through a SBEM stack showing BDA-labeled HVC _(RA) somata.
639	(g) Inhibitory (blue spheres) and excitatory (gold spheres) synapses onto an $HVC_{(RA)}$ dendrite in
640	the SBEM volume. Sphere cross-sectional areas are proportional to the active zone area. (\mathbf{h})
641	Higher magnification of a dendritic branch from (g). (i) Density of asymmetric and symmetric
642	synapses vs. the distance to the soma. (j) Two $HVC_{(RA)}$ dendrites; red spheres indicate double-
643	labeled synapses, with cross sections through two synapses (insets). Inset, cross sections
644	through the synapses circled in red. (k) Active zone size distributions of inhibitory (blue),
645	excitatory (black), and double-labeled (red) synapses. Scale bars are 10 μm in b and c, 25 μm
646	in f, and 0.25 μm in j.
647	

Figure 1—figure supplement 1. Sample preparation for LM and EM. (a,b) For LM, HVC_(RA)
neurons are retrogradely labeled by injecting a fluorescent dextran (fluoro-Ruby) into RA (a),
and a single labeled neuron is targeted and filled with Neurobiotin under the guidance of 2-

651	photon microscopy (b). (c) The tissue is then fixed and 100 μ m parasagittal sections are sliced
652	through the entirety of HVC. (d,e) Sections are further processed to stain Neurobiotin-labeled
653	neurites (d) and then imaged in brightfield with a 100x objective (e). (f) For EM, $HVC_{(RA)}$
654	neurons are retrogradely labeled with biotinylated dextran (BDA). (g,h) A single 200 μ m
655	parasagittal section is taken from the center of HVC $({f g})$ and further processed to stain BDA-
656	labeled neurites (h). (i , j) A cube of tissue from within the center of HVC is extracted and stained
657	by ROTO (reduced osmium OTO) (i) before being imaged via SBEM (j).
658	
659	Figure 1—figure supplement 2. Synaptic boutons on HVC _(RA) axon collaterals. (a) An LM
660	reconstruction of $HVC_{(RA)}$ axon collaterals of one neuron with the HVC border indicated by
661	dashed lines. Locations of all synaptic boutons are marked by grey spheres. (b) Bouton density
662	of collateral branches as a function of their midpoint distances from the soma.
663	
664	Figure 1—figure supplement 3. Ultrastructural classification of synapses. (a) An
665	asymmetric synapse onto a BDA-labeled $HVC_{(RA)}$ dendrite whose morphology is partially
666	obscured by the label. Red arrows indicate the synaptic cleft. (b to d) Other synapses made by
667	the same axon onto unlabeled dendrites. The pronounced postsynaptic density (PSD),
668	especially for synapse 4, confirms the classification of this connection as excitatory. (${f e}$) A
669	symmetric synapse onto a BDA-labeled $HVC_{(RA)}$ dendrite. (f to h) Synapses from the same
670	neuron onto other unlabeled dendrites display a lack of a PSD and a different appearance of
671	synaptic vesicles compared with the asymmetric synapses. Scale bar: 0.5 μ m.

6/3	Figure 1—figure supplement 4. The BDA label is inefficient and incomplete. (a) All cells
674	within our SBEM dataset are represented by spheres at the location of the cell body. Known
675	$HVC_{(RA)}$ neurons, which were labeled with BDA, were colored red. Also shown are putative
676	$HVC_{(RA)}$ neurons, classified by morphological features of the soma and dendrite (pink), other
677	neuron types (large gray spheres), and glia (small gray spheres). Scale bar: 50 $\mu m.~(\textbf{b})$
678	Incomplete labeling of axonal collaterals of $HVC_{(RA)}$ neurons inside HVC is demonstrated with a
679	skeleton reconstruction (labeled axon in black and unlabeled axon in gray). The inset electron
680	micrographs correspond to the portions of the axonal field indicated. Scale bars: left: 1 μ m, right:
681	5 µm.
682	
607	Figure 2 Classification of postsynantic targets (a) A BDA labeled aven with 4 synantic
085	rigure 2 classification of postsynaptic targets. (a) A DDA-labeled axon with 4 synaptic
684	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue,
684 685	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b)
684 685 686	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right)
683684685686687	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right) in LM. Spine locations are indicated by grey spheres. (c , d) Spine densities for each of these
 683 684 685 686 687 688 	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right) in LM. Spine locations are indicated by grey spheres. (c , d) Spine densities for each of these neuron classes from LM (c) and EM (d) reconstructions. Insets show examples with spines
 683 684 685 686 687 688 689 	boutons (boxes). One bouton and its postsynaptic targets. (a) A DDA-habeled axon with 4 synaptic boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right) in LM. Spine locations are indicated by grey spheres. (c,d) Spine densities for each of these neuron classes from LM (c) and EM (d) reconstructions. Insets show examples with spines indicated by arrowheads. (e) SBEM-based reconstructions of two HVC _(RA) somata with their
 683 684 685 686 687 688 689 690 	boutons (boxes). One bouton and its postsynaptic targets. (a) A BDA-labeled axon with 4 synaptic boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right) in LM. Spine locations are indicated by grey spheres. (c,d) Spine densities for each of these neuron classes from LM (c) and EM (d) reconstructions. Insets show examples with spines indicated by arrowheads. (e) SBEM-based reconstructions of two HVC _(RA) somata with their proximal axons. Blue, green, and red spheres mark the location of synapses with inhibitory
 683 684 685 686 687 688 689 690 691 	boutons (boxes). One bouton and its postsynaptic structure labeled in red and blue, respectively: In cross section (top right) and as a surface reconstruction (bottom center). (b) Dendrites from an inhibitory interneuron, an HVC _(RA) neuron, and an HVC _(X) neuron (left to right) in LM. Spine locations are indicated by grey spheres. (c , d) Spine densities for each of these neuron classes from LM (c) and EM (d) reconstructions. Insets show examples with spines indicated by arrowheads. (e) SBEM-based reconstructions of two HVC _(RA) somata with their proximal axons. Blue, green, and red spheres mark the location of synapses with inhibitory interneurons, HVC _(RA) neurons, and HVC _(X) neurons, respectively. Scale bar is 0.25 µm in a.

693	Figure 2—figure supplement 1. Morphological markers of interneurons. (a) Ultrastructural
694	and morphological differences of the somata of an HVC interneuron (left, blue shade) and an
695	$HVC_{(RA)}$ neuron (right, red shade). Compared with $HVC_{(RA)}$ neurons, interneurons had large
696	amounts of endoplasmatic reticulum (ER), many mitochondria, and a large cell body. Scale bar:
697	7.5 μ m. (b) An electron micrograph (cut plane rotated to show spine attached to dendrite)
698	showing a polysynaptic protrusion (blue label) that receives four synapses at its tip, that was
699	previously misclassified as a dendritic spine of an excitatory cell. The four presynaptic axons are
700	colored in yellow, green, purple and red. Scale bar: 1 μ m.
701	
702	Figure 3 Spatial variation of postsynaptic cell type. (a) SBEM-based reconstructions and
703	synaptic targets for two orphaned axon segments. Colored spheres mark the locations and
704	types of synapses. (b) Axon collaterals (LM-based reconstruction) of an $HVC_{(\text{RA})}$ neuron with
705	branch nodes (gold circles), the soma (black circle), and the HVC border (dashed lines). ($m{c}$)
706	Mean axon length (black) and branch node densities (gold) vs. soma distance (n=15 cells). (d)
707	The ratio of synapses onto inhibitory interneurons vs. estimated distance from the soma (p <
708	0.005, Pearson's correlation). (e , f) The density of synapses onto $HVC_{(RA)}$ (e) and $HVC_{(X)}$ (f) vs.
709	estimated distance from soma (p < 0.002, Pearson's correlation, combining $HVC_{(RA)}$ and $HVC_{(X)}$
710	values). (g) Total synaptic size (summated active zone area, $\mu m^2/mm$) onto excitatory neurons
711	vs. estimated distance of the presynaptic axon from the soma ($p < 0.05$, Pearson's correlation).
712	Vertical error bars: SEM of the Poisson-distribution means estimated from the number of
713	synapses on each axon segment (e-g) or the SEM of an assumed underlying binomial count

distribution (d). Horizontal error bars from quantiles 0.16 to 0.84 of the distance distribution
based on the nearest neighbor sampling approach (see Methods). (h) Proposed circuit
architecture. HVC_(RA) neurons (red) target inhibitory interneurons (blue) proximally and other
HVC_(RA) neurons distally.

718

719 Figure 3—figure supplement 1. Synaptic properties of HVC_(RA) axons, using a Bayesian approach to estimate distance from soma. (a) Total synaptic strength (summated active zone 720 721 area/pathlength) onto excitatory neurons vs. estimated distance of the presynaptic axon from the soma (p < 0.05, Pearson's correlation). (b) The ratio of synapses onto inhibitory 722 interneurons vs. estimated distance from soma (p < 0.01, Pearson's correlation). (c,d) The 723 724 density of synapses onto HVC_(RA) (c) and HVC_(X) (d) vs. estimated distance from soma (p < 0.002, Pearson's correlation, combining $HVC_{(RA)}$ and $HVC_{(X)}$ values). Vertical bars represent the 725 726 SEM of an assumed underlying Poisson distributed synapse counting process (**a**,**c**,**d**) or (**b**) the 727 SEM of an assumed underlying Binomial count distribution. (a-d) Horizontal error bars 728 correspond to a 0.16 and 0.84 quantile of the Bayesian posterior distribution, see Methods. 729 Figure 3—figure supplement 2. A SBEM-based reconstruction and synaptic targets for an 730 orphaned axon with high branch density. Small spheres mark the location of synapses, with 731 the color indicating the target type. Note the higher frequency of inhibitory targets (blue) along 732 the length of the reconstruction compared with other orphaned axons with low branch density 733 (see Figure 3a). 734

736	Figure 3—figure supplement 3. A small population of RA neurons project to HVC. (a) The
737	borders of RA were traced across nine sequential 100 μm thick sagittal sections, and the
738	location of each retrogradely labeled HVC-projecting RA neuron is marked with a dot. (b) Dil
739	injection in HVC resulted in robust retrograde labeling of upstream motor nuclei Uva and NIf,
740	while only a small percentage (< 1%) of cells in RA were labeled (a , c). An example confocal
741	image of RA is shown in (${f c}$), revealing a sparse population of retrogradely labeled neurons in
742	the posterior region of the nucleus.
743	
744	Supplementary Video Legends
745	Video 1. Video shifting through a z-stack of a sagittal section within HVC, containing a
746	Neurobiotin-filled $HVC_{(RA)}$ neuron stained with DAB. Number of z-sections shown is 144. Voxel
747	size is 92 x 92 x 500nm.
748	
749	Video 2. Video of a subregion of the acquired SBEM dataset, showing the original data
750	resolution (lossy compression). Number of z-sections shown is 100, translating to 2.9 $\mu m.$
751	
752	Video 3. Video of a subregion of the acquired SBEM dataset, showing a larger field of view with
753	a BDA-labeled $HVC_{(RA)}$ soma (lossy compression). Number of z-sections shown is 200,
754	translating to 5.8 μm.

- **Video 4.** Video of a z-stack of 18 consecutive images (100 x 100 pixels) showing a symmetric
- 757 synapse. Voxel dimensions: 11 x 11 x 29.
- **Video 5.** Video of a z-stack of 18 consecutive images (100 x 100 pixels) showing an asymmetric
- 760 synapse. Voxel dimensions: 11 x 11 x 29.

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1002







Figure 1 - supplement 3



Figure 1 - supplement 4



Figure 2



Figure 2 - supplement 1



b







Figure 3 - supplement 2



