

Silent songs: What birds rehearse during sleep

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Brain activity during sleep plays an important role in memory consolidation, including motor memory. One suggested mechanism of how neural activity effects these benefits is through reactivation of neurons in patterns resembling those of the preceding experience. It is largely unknown for any system, which specific patterns of motor activation are replayed during sleep. Brain areas devoted to song production in the songbird brain exhibit spontaneous song-like activity during sleep, but single cell neural recordings did not permit detection of the specific song patterns. We have now discovered that this sleep activation can be detected in the muscles of the vocal organ, thus providing a unique window into song-related brain activity at night. We show that male zebra finches frequently exhibit spontaneous song-like activity during the night, but that the fictive song patterns are highly variable and uncoordinated compared to the highly stereotyped day-time song production. This substantial variability is not consistent with the idea that night-time activity replays day-time experiences for consolidation, but may instead serve to generate internal error signals that help maintain the high stereotypy of day-time song. This alternative function of sleep motor activity may apply more generally to other behaviors, including human dream-related motor activity. rV

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Abstract: Brain activity during sleep plays an important role in memory consolidation, including motor memory. One suggested mechanism of how neural activity effects these benefits is through reactivation of neurons in patterns resembling those of the preceding experience. It is largely unknown for any system, which specific patterns of motor activation are replayed during sleep. Brain areas devoted to song production in the songbird brain exhibit spontaneous song-like activity during sleep, but single cell neural recordings did not permit detection of the specific song patterns. We have now discovered that this sleep activation can be detected in the muscles of the vocal organ, thus providing a unique window into song-related brain activity at night. We show that male zebra finches frequently exhibit spontaneous song-like activity during the night, but that the fictive song patterns are highly variable and uncoordinated compared to the highly stereotyped day-time song production. This substantial variability is not consistent with the idea that night-time activity replays day-time experiences for consolidation, but may instead serve to generate internal error signals that help maintain the high stereotypy of day-time song. This alternative function of sleep motor activity may apply more generally to other behaviors, including human dream-related motor activity.

Introduction

Brain activity during sleep is thought to play an important role in consolidation of declarative and procedural memory (e.g., Maquet, 2001; Stickgold, 2005; Diekelmann & Born, 2010; Yang et al., 2014; Tononi & Cirelli, 2014), and one suggested mechanism of how neural activity effects these benefits is through reactivation of neurons in patterns that resemble those of the preceding experience during the active period (Wilson & McNaughton, 1994; Dave & Margoliash, 2000; Hahnloser, Kozhevnikov & Fee, 2002; 2006; Euston, Tasuno & McNaughton, 2007; Peyrache et al., 2009; Shank & Margoliash, 2009). Specifically, motor replay during sleep can be induced by sensory cues and is thought to consolidate motor memory through sensorimotor re-processing in the relevant brain areas (Derégnaucourt et al., 2005; Margoliash, 2005; Orban et al., 2006; Hupbach et al., 2009). However, the role of sleep on memory formation for a specific newly acquired motor skill is debated (e.g., Korman et al., 2003; Rickard et al., 2008; Brawn, Nusbaum & Margoliash, 2010). Furthermore, alternative patterns of sleep activation have been reported and led to different, debated hypotheses regarding the function of this brain activity (e.g., Dragoi & Tonegawa, 2011; 2013; Brawn & Margoliash, 2015; Eichenbaum, 2015; Silva, Feng & Foster, 2015; Grosmark & Buzsáki, 2016).

This possibility of multiple functions of sleep activation patterns is also suggested by the occurrence of replay in well-established and stereotyped motor behaviors (Dave & Margoliash, 2000; Margoliash & Schmidt, 2010). Mechanisms for how sleep activation enhances consolidation of recently acquired memories may be different from those involved in stereotyped motor sequences, but this distinction has not been clearly made. In general, our understanding of how night-time motor replay in the brain can benefit motor performance is impeded by the fact that we do not have detailed insight into the nature of the replayed motor patterns.

One of the best postulated examples for motor replay is learned vocal behavior (Giret, Edeline & DelNegro, 2017). In birds, activity of neurons in sensorimotor motor (HVC) and motor cortical (the robust arcopallial nucleus, RA) areas strongly suggested that they were activated in song-like manner at night during song playback as well as spontaneously (Dave & Margoliash, 2000; Hahnloser, Kozhevnikov & Fee, 2002; 2006). However, constraints on recording from a large number of neurons simultaneously and on maintaining single unit responses over sufficient time spans did not permit detection of which song sequences are replayed at night. Birdsong is a learned behavior, whose control involves coordination of multiple motor systems to generate a highly stereotyped acoustic sequence (Brainard, 2008; Goller & Cooper, 2008; Suthers & Zollinger, 2008; Méndez et al., 2010; Riede & Goller, 2010; Beckers, 2013). Insight into the specific motor patterns of night-time brain activation would therefore be a major advance in our understanding of how activity during sleep might benefit stereotyped motor control of complex behavior. Here we use song-like night-time activation of the muscles controlling the vocal organ of birds as a sufficiently detailed output to allow identification of which song syllable sequence is replayed in the brain during night-time.

Material and methods

During this study ten adult male zebra finches were used (age >120 days). They were housed individually in a 31.8 cm x 22.9 cm x 27.9 cm wire cage with newspaper lining. They were fed a mixture of red and white millet, canary seed, and water *ad libitum*. This diet was supplemented with peas and corn every other day. Before any surgical procedure was performed, a baseline recording of song was obtained using a directional microphone (Audiotechnica 835B) placed approximately 20 cm away from the bird. The microphone output was amplified using a

Brownlee 410 amplifier (200-400x; Brownlee Precision) and connected to an analog to digital converter (National Instruments). Recordings were obtained using Avisoft-Recorder (Avisoft Bioacoustics) at 44.1 kHz sample rate.

Zebra finches were accustomed to the procedures three to five days before the surgery by first attaching a leash and backpack to the bird. The backpack is custom-built and consists of a Velcro tab on the back that is secured on the bird with elastic bands around the base of each wing and around the upper part of the thorax. Birds were tethered by a wire, which was fixed on the backpack and connected to a balancing lever arm positioned above the cage to allow the bird to move freely. Once birds resumed singing activity on the tether, surgical procedures were initiated. One hour prior to surgery, birds were deprived of food and water.

Surgery was performed under general anesthesia by administering Ketamine/Xylazine. During surgery, a flexible cannula was inserted into a thoracic air sac. The cannula was sutured and adhered (Vetbond; 3M Animal Care Products) to the rib cage and attached to a piezoresistive pressure transducer (Fujikura FPM-02PG) mounted on the backpack. Next, the syrnix was accessed by a skin incision in the furcula area and opening of the interclavicular air sac membrane. The tips of custom-built bipolar wire electrodes (California Fine Wire, SS 304; 25 μ m) were inserted into the syringeal muscles. Bipolar electrodes were placed in two different muscles during surgery. In each bird, we recorded from either 2 different muscles on the same side, or from left and right muscles (Fig. S1; Table S1). The electrodes were adhered to the surface of the syringeal muscles with tissue adhesive (Vetbond). Electrode wires were routed subcutaneously to the backpack where the ends were attached to a connector from which larger wires made connection to signal conditioning equipment. Following surgery, the bird was placed in the cage, tethered, and allowed to recover overnight.

Following surgery, four channels were recorded simultaneously using Avisoft-Recorder, air sac pressure, two EMGs, and audio. EMG channels were band pass filtered (100-3000 Hz) with a gain of 1000x-3000x (Brownlee Precision, 440). Audio recording was done with the same settings that were used to record pre-surgery song. Prior to any nighttime recording, we obtained multiple examples of complete, directed song from the male during the day by placing a female in a cage next to him. The spectrograms from these songs were compared to those recorded pre-surgery to ensure that no damage was done to the syringeal muscles during surgery.

During the night, all channels were continuously recorded at a sample rate of 8 kHz. Recordings were started and stopped manually. The photoperiod was set from 6:00 AM to 8:00 PM and was controlled by an automatic timer.

Comparison of spontaneous EMG activity to EMG activity that occurred during song was done using custom written software implementing the following procedures. The simultaneous measurement of air sac pressure and muscle activity (EMG) for singing birds was used to segment the latter into syllable-related fragments. We computed the envelopes of the EMG signals, and those smoothed time series were cut at specific time points, chosen in the following way. The minima of the pressure patterns with subatmospheric values of air sac pressure were computed, and then, for each minimum, we looked for the immediately following minimum of the simultaneously measured EMG envelope. Those times were used to cut the EMG envelope in N segments, corresponding to the each syllable of the song. These EMG segments corresponding to syllables are hereafter called syllable templates.

The envelopes of EMG signals were computed by applying a Hilbert transform (impulse response filter length IRFL=128), followed by a first order integration ($\tau_{\text{int}}=0.01$), and a Savitsky Golay filter (Nleft=256, Nright=256). We applied this procedure to the syllable templates, as

well as to the EMG data recorded during the night ($n(t)$). Then, we computed the correlation between the envelope of the night data $n(t)$ and the envelope of each of the syllable templates, shifted at delays τ between 0 and $T - T_{template}$, where T is the duration of the night recording and $T_{template}$ the duration of the template analyzed. In this way, for each of the templates, we obtained a continuous time series whose largest peaks indicate a high correlation between a fragment of the envelope of the night data, and the syllable template under analysis. In order to identify the largest correlation values, we computed for each bird, all the maxima of the correlation coefficients with all the templates. Then, we fitted a Gaussian $G(\mu, \sigma)$ to the resulting histogram, and defined the threshold value X such that $Z = (X - \mu) / \sigma = 1.64$. With this choice of threshold, every segment of the envelope of the night activity $n(t)$, whose correlation with a template is higher than X , was found to correspond to a segment of the time series in which activity was found (no false positives), and was similar to the template. To test the automated search algorithm, we compared EMG patterns of syllables during song to establish correlation coefficients for matching and non-matching syllables. For matching syllables the mean correlation coefficient and STD was 0.75 ± 0.23 ($n=75$) and for comparisons of different syllables of 0.24 ± 0.19 ($n=75$). The criterion of 0.8 for identification of EMG patterns that match specific syllables therefore constitutes a conservative approach toward identification of nocturnal EMG patterns. No false positive segments were identified with this approach, although some matching EMG segments may have been discarded with this high threshold. Visual inspection of > 500 identified cases was used to further confirm the selectivity of the automated search approach and the choice of 0.8 as threshold correlation value.

To quantitatively assess night-time EMG sequences for syllable sequence, we identified the one syllable which occurred most frequently during SLA for each individual. Then we quantified the highest correlation score for all other syllables around the identified syllable. To account for timing differences between song and SLA, we searched within 640 ms near the time point of the syllable as expected from day-time song motifs. From these data we compiled histograms of correlation scores for each individual to assess syllable sequences that occur during SLA.

Results

Adult male zebra finches produce a stereotyped song sequence that is composed of a repeated series of acoustically distinct syllables, called motif (Zann, 1996; Franz & Goller, 2002; Williams, 2008; Wood et al., 2013). Each song syllable is generated by a stereotyped and characteristic respiratory pulse, which is coordinated with specific activation patterns of syringeal muscles (Fig. 1A,B) (Vicario, 1991a; Goller & Cooper, 2004; Méndez et al., 2010). After recording subsyringeal air sac pressure and electromyograms (EMG) from syringeal muscles in adult male zebra finches during song, we then monitored physiological activity during the night. Syringeal muscles showed spontaneous song-like activation (SLA) during the night. Using a search algorithm based on template matching of the EMG patterns for song syllables, we scanned night-time files for activity. The algorithm showed sufficient distinctive power that permitted reliable identification of EMG patterns from different syllables (see Methods) during day-time song and night-time activity. Even with stringent criteria for the search algorithm, SLA

in the syrinx was found remarkably frequently throughout the night, with a range of 110 to 2370 (7 birds, over a total of 350 hrs of night-time recording) syllable-like occurrences spread throughout the night-time period (Fig. 2A). However, while SLA occurred in the syrinx, the respiratory system was not simultaneously activated in a song-like fashion and, therefore, no sound was produced. Respiratory rate during syringeal SLA (1.59 ± 0.46 Hz; $n = 179$; 6 birds) was indistinguishable from normal breathing at night (1.53 ± 0.36 Hz; $n=177$; 6 birds). Exhalation amplitude and duration were not song-like during SLA. Amplitude expressed as normalized relative voltage output during song was 8 ± 0.23 ($n=83$ from 5 birds) whereas amplitude during syringeal SLA was 0.9 ± 0.04 , $n=100$ from 5 birds. Additionally, the duration of expiratory pressure pulses during syringeal SLA was 0.61 ± 0.33 s compared to 0.13 ± 0.07 s during song). The prolonged duration of expiration compared to awake breathing indicates that the birds were asleep (Fig. 2B). Of all the SLA events, we only found a different, more song-like respiratory pattern once in one bird, but the pressure was still not sufficiently elevated to result in phonation (Fig. 2B). Although it is unclear whether or not night-time SLA specifically in the syrinx serves a function in maintaining the peripheral or central motor mechanisms, it provides a unique and likely complete record of song-related motor activity in the brain.

Although complete EMG patterns of the entire motif were occasionally replayed at night (Fig. 1), most of the EMG activity was not a stereotyped repetition of activity during day-time song. To quantify this, we used mean EMG patterns of individual syllables as a template to scan the night-time files for SLA occurrence and then determined how much of the full song motif was replayed. We chose data from five birds with the most distinctive EMG signals for different syllables. First, we used a subset of SLA occurrences to visually categorize 457 SLA events into one of seven categories of activity (Fig. 3). The categories describe the degree of completeness

of the motif and capture deviations in timing from a typical song motif. Of these seven categories, on average over 50% of SLA occurrences fell into the single syllable or partial syllables categories. In contrast, replays of complete motifs occurred in only 7% of the total instances of SLA (Fig. 3D, Table S2).

Consistent with previous work (Vicario, 1991a; Franz & Goller, 2002), motor gestures of song production in adult male zebra finches were highly stereotyped (Fig. 4A,B). In contrast, night-time SLA was extremely variable when compared to stereotyped EMG activity of the song motif during day-time song (Fig. 4C). Motor replay consisted of single or multiple syllables without a discernible pattern for which particular syllable in the motif preferentially occurred during SLA. The timing between syllable EMG patterns was also more variable during night-time activity when compared to timing during song. The mean duration between syllables during night-time SLA was longer by 3 ms compared to day-time song and was generally more variable (Fig. 3E).

In addition to the variable timing and inconsistent ordering of syllables during SLA, other phenomena occurred in SLA that were never seen in stereotyped song production. EMG patterns of individual syllables showed deviations from the stereotyped pattern of day-time song. Incomplete syllables occurred, with either the first or the last half of the activity pattern missing or only present at a lower EMG amplitude. In other instances, parts of a typical EMG pattern for a syllable were omitted with the rest of the syllable pattern shifted in time, while the other muscle performed the standard song like pattern (Fig. 3C). This caused a mismatch in the SLA pattern between the two syringeal sound generators.

Second and in addition to analyzing this subset, we quantified SLA structure for the entire data set. For each bird, we chose SLA occurrences of the most frequently generated

syllable and compared the EMG activity near this syllable to all other templates, allowing for different timing. If a full motif was executed, the other cross correlation coefficients should be near our cutoff threshold of 0.8. Any deviations from a full motif will yield low correlation coefficients for the other syllables. The data show clearly for all birds that the full motif was rarely produced (Fig. 4D), as correlation coefficients for other syllables rarely exceed the 0.8 cutoff criterion. Furthermore, activation patterns for different syllables occurred at very different rates, because correlation coefficients for some syllables remained much lower than those for others. Whereas the mean correlation coefficients for the target syllables ranged from 0.82-0.89, those for the other syllables ranged from 0.39-0.82. Finally, this analysis reveals differences between individuals in respect to the syllable composition of SLA sequences (Fig. 4D).

Discussion

Here we have shown that night-time SLA does not only occur in the forebrain circuitry (HVC and RA - Dave & Margoliash, 2000; Hahnloser, Kozhevnikov & Fee, 2002; 2006; Area X - Yanagihara & Hessler, 2012), but that this activity also is relayed to the syringeal muscles. Whereas during song production RA initiates activation of both respiratory pre-motor circuits and the syringeal motor neurons (nXIIts) (e.g., Vicario, 1991b; Roberts et al., 2008; Schmidt, McLean & Goller, 2012), during SLA only activation of the syringeal motor system occurs. The specific mechanism for disengaging respiration from the song motor sequence is not known, but inhibition at the level of the respiratory pre-motor nuclei may prevent the song-like activation of the respiratory system and, thus, sound generation.

The functional significance of activating the syringeal muscles during night-time motor replay is unclear. Because song generation involves coordinated activity of respiratory, vocal

organ and upper vocal tract motor systems, the activation of only one of them during SLA is unlikely to provide useful peripheral feedback information for consolidation of the central song motor program. The activation of the whole motor circuit including the syringeal motor nucleus (nXIIIts) may be necessary for providing benefits to the maintenance of the motor program. Alternatively, the activation of the syrinx may not be serving any function for song program consolidation, but, unlike respiration, may not have been selected against as it produces no externally visible movement and is likely not very energetically costly (Oberweger & Goller, 2001; Franz & Goller, 2003). Whether or not it may provide stimuli needed for the homeostatic maintenance of the superfast syringeal muscles remains unclear (Elemans et al., 2008; Uchida et al., 2010).

Nevertheless, the feed through of central activity to the syrinx provides the first detailed insight into the frequency of occurrence and specific features of motor replay of song-like activity in the brain. Such detailed information is not available for any complex behavior and, thus, enables us to characterize spontaneous motor activity for the first time. SLA occurred throughout the night period and very frequently. Replayed motor gestures for individual syllables are not consistently ordered into the correct motif sequence, are often incomplete, and even coordination of the left and right motor pathways to the two sound generators of the syrinx is not consistently present.

These findings are largely consistent with spontaneous RA activity during sleep (Dave & Margoliash, 2000). Individual neurons in RA spike at specific syllable segments and are silent during the remaining song components. A full assessment of song-like activity during sleep is therefore not possible from these neuronal data. Whereas the spike patterns of spontaneous activity during sleep can be matched to activity during song performance, the absence of spikes

and non-matching bursts are difficult to interpret (Dave & Margoliash, 2000; Shank & Margoliash, 2009; Rauske et al., 2010). Syringeal activation therefore provides more information about which song elements are replayed and permits the interpretation that sleep activation is not replay of the stereotyped motor program for song. This conclusion therefore differs from other systems where night-time activation is thought to replay previously experienced sequences fairly faithfully, albeit with different tempos, to consolidate newly acquired memories (e.g., Wilson & McNaughton, 1994). In contrast to these findings, the motor replay patterns in adult zebra finches suggest that night-time activity constitutes a highly variable motor activation that may be similar to plasticity experienced during vocal learning (Tchernichovski et al., 2001; Derégnaucourt et al., 2005; Shank & Margoliash, 2009; Ölveczky et al., 2011).

During the sensorimotor period of song development, birds “practice” song production and generate error signals in the auditory feedback that are thought to be used for refining imitation of the acquired song model. Interestingly, SLA in HVC occurs less frequently in young birds during the sensorimotor phase than in adult birds (Crandall et al., 2007). In adult birds, however, song production is highly stereotyped, and variation in tempo and acoustic parameters (e.g., frequency) is very small (1-5%; e.g., Franz & Goller, 2002; Cooper & Goller, 2006; Crandall et al., 2007; Williams, 2008; Méndez et al., 2010; Wood et al., 2013). Frequent SLA and its high variability relative to the stereotyped motif of day-time song could be related to the maintenance of the motor program.

A possible mechanism for how variable SLA enhances the stability of the song motor program is the generation of internal error signals that contribute to motor stability. An efference copy of HVC activation is thought to be involved in auditory feedback controlled song learning (e.g., Troyer & Doupe, 2000; Prather et al., 2008; Mooney, 2009; Bolhuis, Okanoya & Scharff,

2010; Brainard & Doupe, 2013; Fee, 2014). In adult birds this efference copy could predict motor output, which could internally be compared to the motor representation of stereotyped song. This internal error generation may counteract the decay in motor memory that is predicted in the absence of error signals (e.g., Kitago et al., 2013; Vaswani & Shadmehr, 2013; Brennan & Smith, 2015) and may facilitate the incorporation of new neurons into the song circuit (e.g., Alvarez-Buylla, Thelen & Nottebohm, 1988; Nottebohm, 2008; Pytte et al. 2012) without jeopardizing the stereotypy of day-time singing. This proposed model makes clear predictions that are testable. If this proposed mechanism is at work in the maintenance of the motor program for highly stereotyped song production, it likely constitutes a more general mechanism for how complex motor programs that are generated in a distributed network of brain areas may be maintained over long periods of time (Criscimagna-Hemminger & Shadmehr, 2008; Vaswani & Shadmehr, 2013).

References:

- Alvarez-Buylla A, Theelen M, Nottebohm F. 1988 Birth of projection neurons in the higher vocal center of the canary forebrain before, during and after song learning. *Proceedings of the National Academy of Sciences USA* **85**, 8722–8726.
- Beckers GJL. 2013 Peripheral mechanisms of vocalization in birds: a comparison with human speech. In: *Birdsong Speech and Language* (J.L. Bolhuis, M. Everaert, eds). The MIT Press, Cambridge, Massachusetts, pp. 399–422.
- Bolhuis JJ, Okanoya K, Scharff C. 2010 Twitter evolution: converging mechanisms in birdsong and human speech. *Nature Reviews Neuroscience* **11**, 747–759.
- Brainard MS, Doupe AJ. 2013 Translating birdsong: songbirds as a model for basic and applied medical research. *Annual Review of Neuroscience* **36**, 489–517.
- Brainard MS. 2008 The anterior forebrain pathway and vocal plasticity. In: *Neuroscience of Birdsong* (H.P. Zeigler, P. Marler, eds). Cambridge Univ. Press, Cambridge, UK, pp. 240–255.
- Brawn TP, Margoliash D. 2015 A bird’s eye view of sleep-dependent memory consolidation. *Current Topics in Behavioral Neuroscience* **25**, 207–237.
- Brawn TP, Nusbaum HC, Margoliash D. 2010 Sleep-dependent consolidation of auditory discrimination learning in adult starlings. *Journal of Neuroscience* **30**, 609–613.
- Brennan AE, Smith ME. 2015 The decay of motor memories is independent of context change detection. *PLoS Computational Biology* **11**, e1004278. (doi.org/10.1371/journal.pcbi.1004278).
- Crandall SR, Adam M, Kinnischtzke AK, Nick TA. 2007 HVC neural sleep activity increases with development and parallels nightly changes in song behavior. *Journal of Neurophysiology* **98**, 232–240.
- Criscimagna-Hemminger SE, Shadmehr R. 2008 Consolidation patterns of human motor-memory. *Journal of Neuroscience* **28**, 9610–9618.
- Cooper BG, Goller F. 2006 Physiological insights into the social-context-dependent changes in the rhythm of the song motor program. *Journal of Neurophysiology* **95**, 3798–3809.
- Dave A, Margoliash D. 2000 Song replay during sleep and computational rules for sensorimotor vocal learning. *Science* **282**, 2250–2254.
- Derégnaucourt S, Mitra PP, Fehér O, Pytte C, Tchernichovski O. 2005 How sleep affects the developmental learning of bird song. *Nature* **433**, 710–716.
- Diekelmann S, Born J. 2010 The memory function of sleep. *Nature Reviews Neuroscience* **11**, 114–126.
- Dragoi G, Tonegawa S. 2011 Preplay of future place cell sequences by hippocampal cellular assemblies. *Nature* **469**, 397–401.
- Dragoi G, Tonegawa S. 2013 Distinct preplay of multiple novel spatial experiences in the rat. *Proceedings of the National Academy of Sciences USA* **110**, 9100–9105.
- Eichenbaum, 2015 Does the hippocampus preplay memories? *Nature Neurosciences* **18**, 1701–1702.
- Elemans CPH, Mead AF, Rome LC, Goller F. 2008. Superfast vocal muscles control song production in songbirds. *PLoS ONE* **3**, e2581.
- Euston DR, Tatsuno M, McNaughton BL. 2007 Fast-forward playback of recent memory sequences in prefrontal cortex during sleep. *Science* **318**, 1147–1150.

- Fee MS. 2014 The role of efference copy in striatal learning. *Current Opinion in Neurobiology* **25**, 194-200.
- Franz M, Goller F. 2002 Respiratory units of motor production and song imitation in the zebra finch. *Journal of Neurobiology* **51**, 129-141.
- Franz M, Goller F. 2003 Respiratory patterns and oxygen consumption in singing zebra finches. *Journal of Experimental Biology* **206**, 967-978.
- Giret N, Edeline J-M, Del Negro C. 2017 Neural mechanisms of vocal imitation: The role of sleep replay in shaping mirror neurons. *Neuroscience & Biobehavioral Reviews* **77**, 58–73.
- Glaze CM, Troyer TW. 2006 Temporal structure in zebra finch song: Implications for motor coding. *Journal of Neuroscience* **26**, 991-1005.
(doi:<https://doi.org/10.1523/jneurosci.3387-05.2006>).
- Goller F, Cooper BG. 2004 Peripheral motor dynamics of song production in the zebra finch. *Annals New York Academy of Science* **1016**, 130-152.
- Goller F, Cooper BG. 2008 Peripheral mechanisms of sensorimotor integration during singing. In: *Neuroscience of Birdsong* (H.P. Zeigler, P. Marler, eds). Cambridge Univ. Press, Cambridge, UK, pp. 99-114.
- Grosmark AD, Buzsáki G. 2016 Diversity in neural firing dynamics supports both rigid and learned hippocampal sequences. *Science* **351**, 1440-1443. DOI: 10.1126/science.aad1935
- Hahnloser RHR, Kozhevnikov AA, Fee MS. 2002 An ultra-sparse code underlies the generation of neural sequences in a songbird. *Nature* **419**, 65-70.
- Hahnloser RHR, Kozhevnikov AA, Fee MS. 2006 Sleep-related neural activity in a premotor and a basal-ganglia pathway of the songbird. *Journal of Neurophysiology* **96**, 794-812.
- Hupbach A, Gomez R L, Bootzin RR, Nadel L. 2009 Nap-dependent learning in infants. *Developmental Science* **12**, 1007-1012.
- Kitago T, Ryan SL, Mazzoni P, Krakauer JW, Haith AM. 2013 Unlearning versus savings in visuomotor adaptation: comparing effects of washout, passage of time, and removal of errors on motor memory. *Frontiers in Human Neuroscience* **7**, 307.
(doi: 10.3389/fnhum.2013.00307).
- Korman M, Raz N, Flash T, Karni A. 2003 Multiple shifts in the representation of a motor sequence during the acquisition of skilled performance. *Proceedings of the National Academy of Sciences USA* **100**, 12492–12497.
- Maquet P. 2001 The role of sleep in learning and memory. *Science* **294**, 1048-1052.
- Margoliash D. 2005 Song learning and sleep. *Nature Neuroscience* **8**, 546-548.
- Margoliash D, Schmidt MF. 2010 Sleep, off-line processing, and vocal learning. *Brain & Language* **115**, 45-58.
- Méndez JM, Dall'Asén AG, Cooper BG, Goller F. 2010 Acquisition of an acoustic template leads to refinement of song motor gestures. *Journal of Neurophysiology* **104**, 984-993.
- Mooney R. 2009 Neurobiology of song learning. *Current Opinion in Neurobiology* **19**, 654–660.
(doi 10.1016/j.conb.2009.10.004).
- Nottebohm F. 2008 The discovery of replaceable neurons. In H. P. Ziegler & P. Marler (Eds.), *The Neuroscience of Birdsong*. pp. 425-448. Cambridge Univ. Press.
- Oberweger K, Goller F. 2001 The metabolic cost of birdsong production. *Journal of experimental Biology* **204**, 3379-3388.

- Ölveczky BP, Otchy TM, Goldberg JH, Aronov D, Fee MS. 2011 Changes in the neural control of a complex motor sequence during learning. *Journal of Neurophysiology* **106**, 386 – 397.
- Orban P , Rauch G, Balteau E, Degueldre C, Luxen A, Maquet P, Peigneux P. 2006 Sleep after special learning promotes covert reorganization of brain activity. *Proceedings of the National Academy of Sciences USA* **103**, 7124-7129.
- Peyrache A, Khamassi M, Benchenane K, Wiener SI, Battaglia FP. 2009 Replay of rule-learning related neural patterns in the prefrontal cortex during sleep. *Nature Neuroscience* **12**, 919-926.
- Prather JF, Peters S, Nowicki S, Mooney R. 2008 Precise auditory–vocal mirroring in neurons for learned vocal communication. *Nature* **451**, 305-310. doi:10.1038/nature06492.
- Rauske PL, Chi Z, Dave AS, Margoliash D. 2010 Neuronal stability and drift across periods of sleep: Premotor activity patterns in a vocal control nucleus of adult zebra finches. *Journal of Neuroscience* **30**, 2783–2794.
- Pytte CL, George S, Korman S, David E, Bogdan D, Kim JR. 2012 Adult neurogenesis is associated with the maintenance of a stereotyped, learned motor behavior. *Journal of Neuroscience* **32**, 7052–7057. (doi:10.1523/jneurosci.5385-11.2012).
- Rickard TC, Cai DJ, Rieth CA, Jones J, Ard MC. 2008 Sleep does not enhance motor sequence learning. *Journal of Experimental Psychology: Learning, Memory, and Cognition* **34**, 834– 842. (doi.org/10.1523/jneurosci.4237-09.2010).
- Riede T, Goller F. 2010. Peripheral mechanisms for vocal production in birds – differences and similarities to human speech and singing. *Brain & Language* **115**, 69-80.
- Roberts TF, Klein ME, Kubke MF, Wild JM, Mooney R. 2008. Telencephalic neurons monosynaptically link brainstem and forebrain premotor networks necessary for song. *Journal of Neuroscience* **28**:3479-3489.
- Schmidt MF, McLean J, Goller F. 2012 Breathing and vocal control: the respiratory system as both a driver and a target of telencephalic vocal motor circuits in birds. *Experimental Physiology* **97**, 455-461.
- Shank SS, Margoliash D. 2009 Sleep and sensorimotor integration during early vocal learning in a songbird. *Nature* **458**, 73-77.
- Silva D, Feng T, Foster DJ. 2015 Trajectory events across hippocampal place cells require previous experience. *Nature Neuroscience* **18**, 1772-1779. doi:10.1038/nn.4151
- Stickgold R. 2005 Sleep-dependent memory consolidation. *Nature* **437**, 1271-1278.
- Suthers RA, Zollinger SA. 2008 From brain to song: the vocal organ and vocal tract. In: *Neuroscience of Birdsong* (H.P. Zeigler, P. Marler, eds). Cambridge Univ. Press, Cambridge, UK, pp. 78-98.
- Tchernichovski O, Mitra PP, Lints T, Nottebohm F. 2001 Dynamics of the vocal imitation process: how a zebra finch learns its song. *Science* **291**, 2564-2569.
- Tononi G, Cirelli C. 2014 Sleep and the price of plasticity: From synaptic and cellular homeostasis to memory consolidation and integration. *Neuron* **81**, 12-34.
- Troyer TW, Doupe AJ. 2000 An associational model of birdsong sensorimotor learning I. Efference copy and the learning of song syllables. *Journal of Neurophysiology* **84**, 1204–1223.

- Uchida AM, Meyers RA, Cooper BG, Goller F. (2010) Fibre architecture and song activation rates of syringeal muscles are not lateralized in the European starling. *Journal of Experimental Biology* **213**, 1069-1078.
- Vaswani PA, Shadmehr R. 2013 Decay of motor memories in absence of error. *Journal of Neuroscience* **33**, 7700-7709.
- Vicario DS. 1991a Contributions of syringeal muscles to respiration and vocalization in the zebra finch. *Journal of Neurobiology* **22**, 63-73.
- Vicario DS. 1991b Organization of zebra finch song control system: Functional organization of outputs from nucleus robustus archistriatalis. *Journal of Comparative Neurology* **309**, 486-494.
- Williams H. 2008 Birdsong and singing behavior. In: *Neuroscience of Birdsong* (H.P. Zeigler, P. Marler, eds). Cambridge Univ. Press, Cambridge, UK, pp. 32-49.
- Wilson MA, McNaughton BL. 1994 Reactivation of hippocampal ensemble memories during sleep. *Science* **265**, 676-679.
- Wood WE, Osseward PJ, Roseberry TK, Perkel DJ. 2013 A daily oscillation in the fundamental frequency and amplitude of harmonic syllables of zebra finch song. *PLoS ONE* **8**, e82327.
- Yanagihara S, Hessler NA. 2012 Phasic basal ganglia activity associated with high-gamma oscillation during sleep in a songbird. *Journal of Neurophysiology* **107**, 424-432. (doi:10.1152/jn.00790.2011).
- Yang G, Lai CSW, Cichon J, Ma L, Li W, Gan W-B. 2014 Sleep promotes branch-specific formation of dendritic spines after learning. *Science* **344**, 1173-1178.
- Zann RA. 1996 *The Zebra Finch: A Synthesis of Field and Laboratory Studies*. Oxford Univ. Press, Oxford, UK.

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Figure legends:

Fig. 1. Song-like activation of syringeal muscles occurs at night without sound generation. (A) Day-time song (shown spectrographically) is accompanied by a stereotyped air sac pressure pattern (P, horizontal line illustrates ambient pressure, relative units) and EMG activity (vTB_L and dS_L are left ventral tracheobronchial and left dorsal syringeal muscles). Colored boxes outline individual syllables, and the corresponding colored bars indicate the EMG activity associated with that syllable. (B) An example of SLA during the night showing activation of syringeal muscles without concurrent song-like air sac pressure patterns. EMG patterns of individual syllables are identified by color bars as in A. SLA includes multiple syllable repeats with one syllable missing. (C) Examples of syllable-specific EMG patterns of the motif of one bird (templates) with a complete motif sequence from night-time activity for comparison as identified in the automated search procedure.

Fig. 2. (A). SLA occurred throughout the night. Specific syllables are identified by color and are replayed with varying frequency during the night. (B). Respiration during night-time SLA (green data point) was normal quiet respiration during sleep and differed in amplitude and duration from daytime quiet respiration (blue) as well as from day-time singing (red). In only one individual night-time SLA occurred occasionally with simultaneously song-like duration and increased amplitude of expiratory pulses (yellow data point). Values are means \pm 1 s.d. (n=250; except for left green data point n=3).

Fig. 3. SLA showed lack of left-right coordination. (A) Respiration during song with colored boxes outlining individual syllables. (B) EMG activity pattern in the indicated syringeal muscle during song. The upward trace shows a rectified (time constant 0.1 ms) and integrated (5 ms) EMG signal and the downward trace is a rectified raw signal for comparison. EMG patterns which correspond to a certain syllable are underlined with the respective color. (C) An example of SLA with altered syllable sequence (red arrow indicates missing syllable). (D) Occurrence of SLA patterns assigned to different categories for illustration of variability. Less than 7% of all occurrences were complete song motifs. (E) The timing of syllable like patterns during SLA was

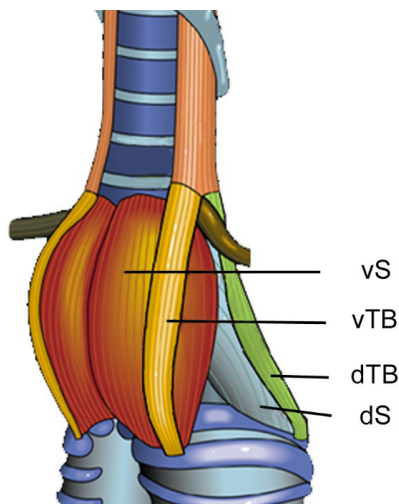
also more variable (red) than inter-syllable intervals during song (black). To quantify intersyllable intervals, we arbitrarily set a threshold of 200 ms on either side of a SLA pattern for it to be considered independent of another. Large negative intervals (>20 ms) in the SLA histogram indicate that the beginning of an EMG pattern for a syllable was missing with the last half shifted back. Measurements were taken as if the entire syllable pattern were present.

Fig. 4. Night-time SLA is highly variable compared to activation during song. (A-C) Overlaid traces (different colors) of 15 song motifs illustrate the high stereotypy of song production (A., subsyringeal air sac pressure, B, rectified and integrated EMG of left and right ventral syringeal muscles). During SLA in contrast, EMG patterns in the same muscles are much more variable (20 different occurrences overlaid). (D) Distribution of correlation coefficients for EMG activity around the most frequently produced syllable (black bars) for each bird. The low scores for activity around the target syllable indicate that the full sequence is rarely produced and different syllable patterns are generated at different frequencies. For example, in the first bird syllable 3 is the most frequently produced syllable, and the correlation scores for syllables 4 and 5 show that they are less frequently produced than 1 and 2.

Supplementary material

523
524

525 Fig. S1



526

527 Each syringeal half is controlled by at least six muscles. The four largest muscles are indicated
528 (vS, ventral syringeal, vTB, ventral tracheobronchial, dTB, dorsal tracheobronchial, dS, dorsal
529 syringeal; modified from 23). Recordings were made from 3 of these on both sides (see Table
530 S1).

531

532 Tables S1-S#

533 Table S1: Recorded muscles for each bird.

| Bird | BR192 | G81 | G74 | G51 | P98 | P106 | P145 | P144 | P188 | P181 |
|---------|--|---------------------------------------|--|--|--------------------------------------|---------------------------------------|---------------------------------------|---------------------------------------|--|--------------------------------------|
| Muscles | dS _L *, vTB _L | dS _L , vTB _L | vTB _L , vTB _R | vTB _L , vTB _R | vS _L , vS _R | vTB _L , vS _R | dS _R , vTB _R | dS _R , vTB _R | vTB _L , vTB _R | vS _L , vS _R |

534 *L and R indicate left or right muscle.

535 Table S2: Average occurrence of each SLA type with standard error.

| Category | 1 Syllable | Syllable + unknown | Two or more syllables | Two or more + unknown | Complete motifs | Partial syllables | Incorrect timing |
|-----------------------|---------------|-----------------------|-----------------------------|-----------------------------|--------------------|----------------------|---------------------|
| Percent occurrence | 20±6.6% | 12±4.2% | 15±4.3% | 5.5±2.2% | 6.1±2.2% | 33±7.4% | 8.1±2.0% |

536

537

Figure 1

EMG patterns during song and sleep

Song-like activation of syringeal muscles occurs at night without sound generation. (A) Day-time song (shown spectrographically) is accompanied by a stereotyped air sac pressure pattern (P, horizontal line illustrates ambient pressure, relative units) and EMG activity (vTB_L and dS_L are left ventral tracheobronchial and left dorsal syringeal muscles). Colored boxes outline individual syllables, and the corresponding colored bars indicate the EMG activity associated with that syllable. (B) An example of SLA during the night showing activation of syringeal muscles without concurrent song-like air sac pressure patterns. EMG patterns of individual syllables are identified by color bars as in A. SLA includes multiple syllable repeats with one syllable missing. (C) Examples of syllable-specific EMG patterns of the motif of one bird (templates) with a complete motif sequence from night-time activity for comparison as identified in the automated search procedure.

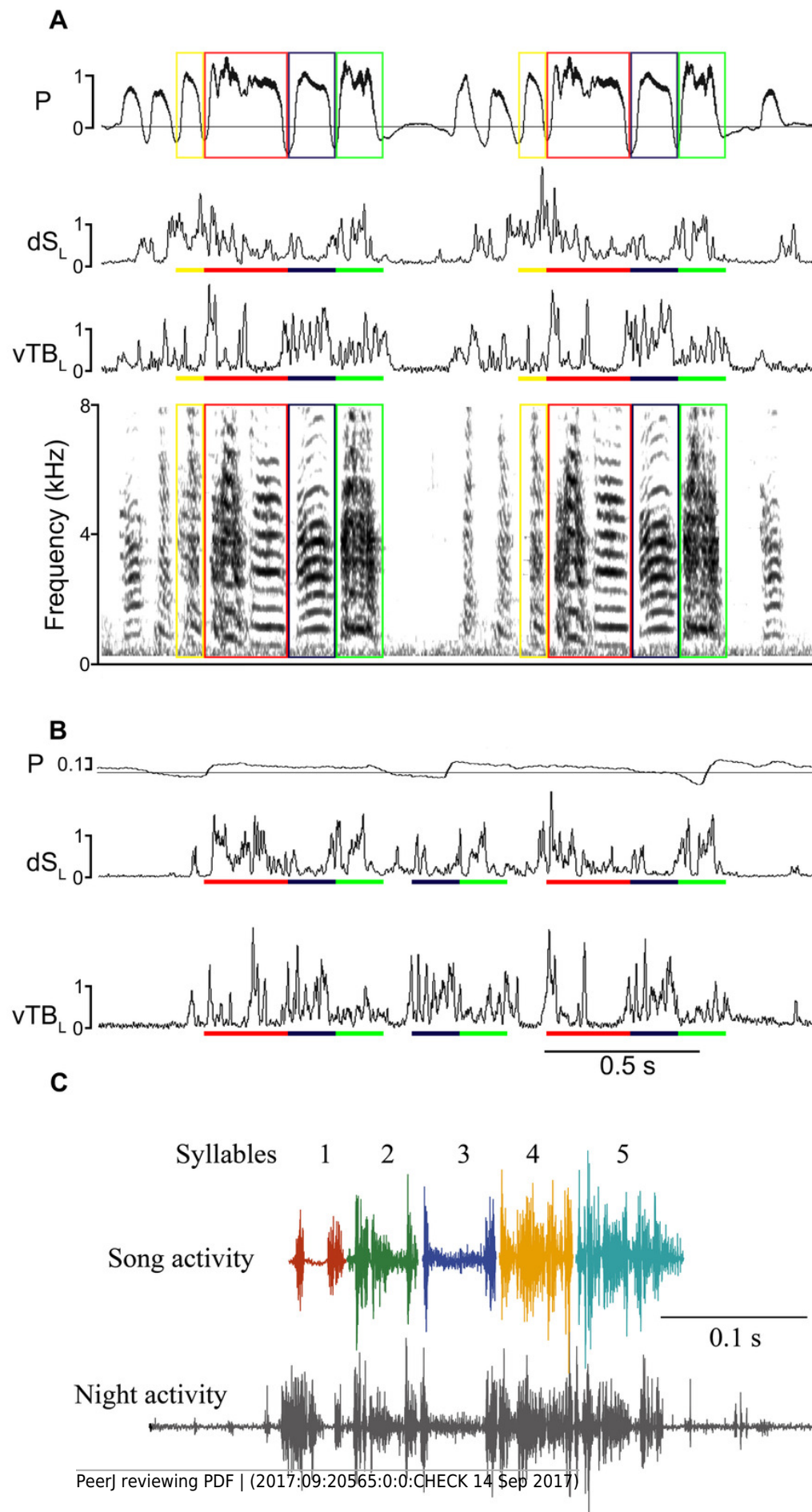
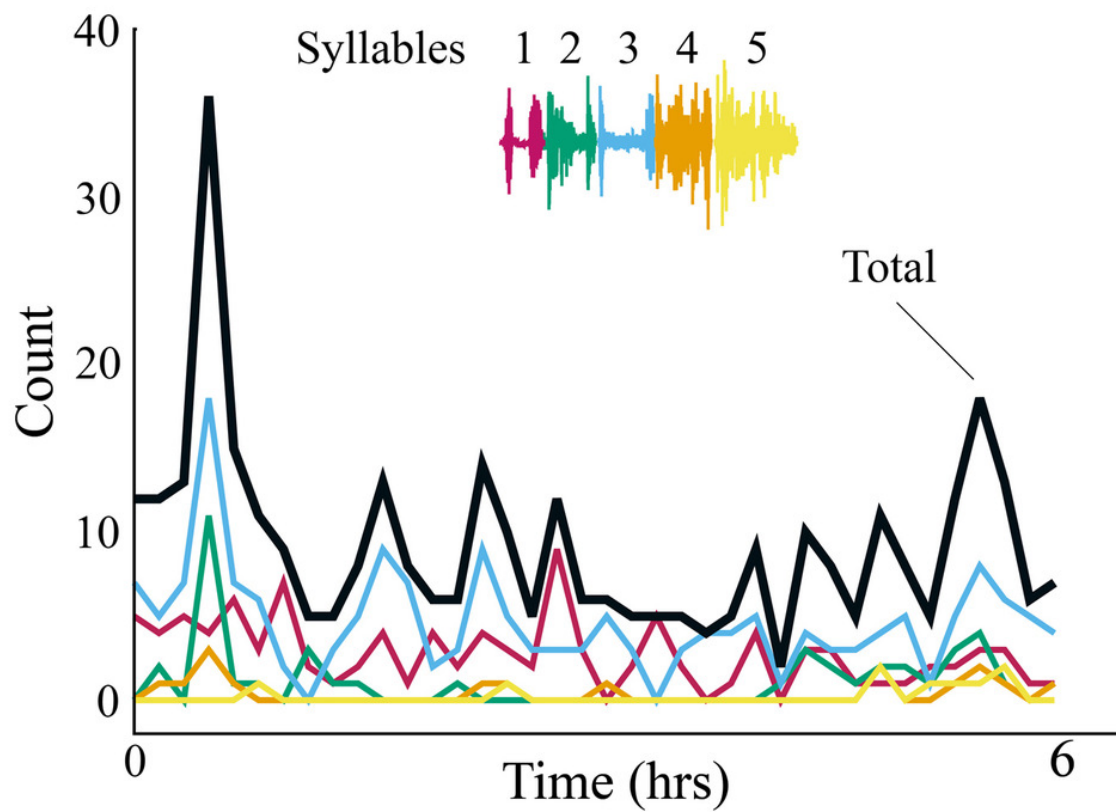


Figure 2

Night-time activation and lack of respiratory activation

(A). SLA occurred throughout the night. Specific syllables are identified by color and are replayed with varying frequency during the night. (B). Respiration during night-time SLA (green data point) was normal quiet respiration during sleep and differed in amplitude and duration from daytime quiet respiration (blue) as well as from day-time singing (red). In only one individual night-time SLA occurred occasionally with simultaneously song-like duration and increased amplitude of expiratory pulses (yellow data point). Values are means \pm 1 s.d. (n=250; except for left green data point n=3).

A



B

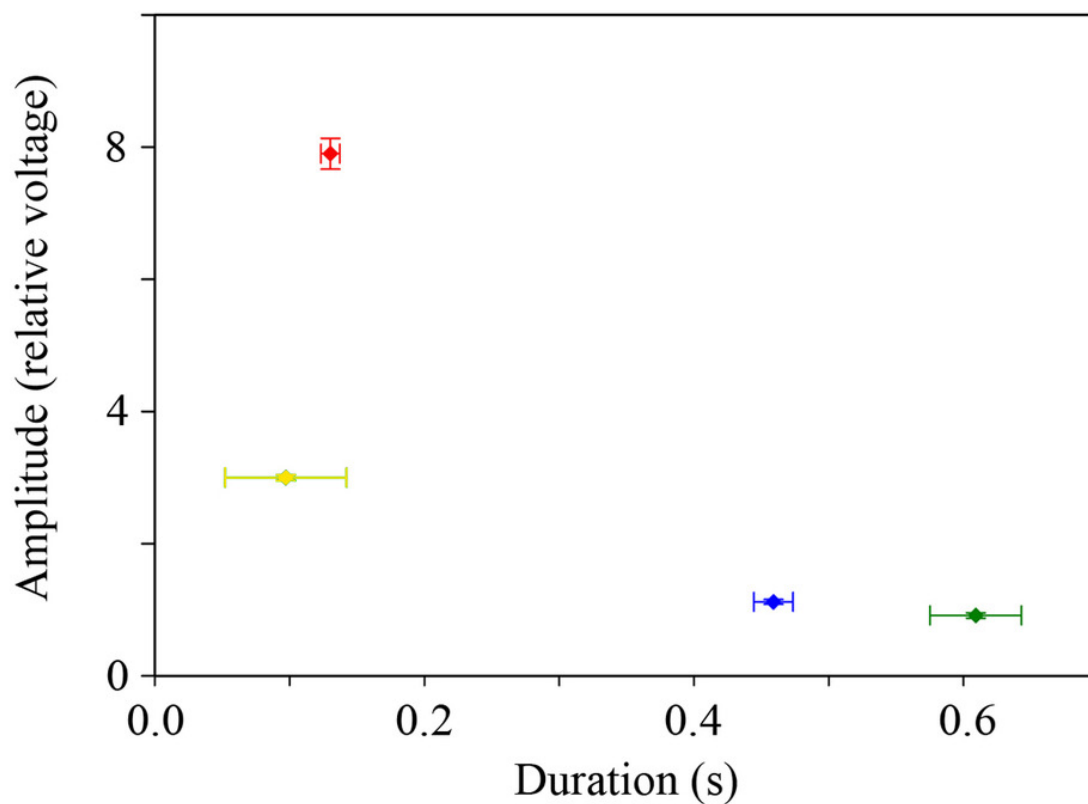


Figure 3

Syllable sequencing during night-time activation

SLA showed lack of left-right coordination. (A) Respiration during song with colored boxes outlining individual syllables. (B) EMG activity pattern in the indicated syringeal muscle during song. The upward trace shows a rectified (time constant 0.1 ms) and integrated (5 ms) EMG signal and the downward trace is a rectified raw signal for comparison. EMG patterns which correspond to a certain syllable are underlined with the respective color. (C) An example of SLA with altered syllable sequence (red arrow indicates missing syllable). (D) Occurrence of SLA patterns assigned to different categories for illustration of variability. Less than 7% of all occurrences were complete song motifs. (E) The timing of syllable like patterns during SLA was also more variable (red) than inter-syllable intervals during song (black). To quantify intersyllable intervals, we arbitrarily set a threshold of 200 ms on either side of a SLA pattern for it to be considered independent of another. Large negative intervals (>20 ms) in the SLA histogram indicate that the beginning of an EMG pattern for a syllable was missing with the last half shifted back. Measurements were taken as if the entire syllable pattern were present.

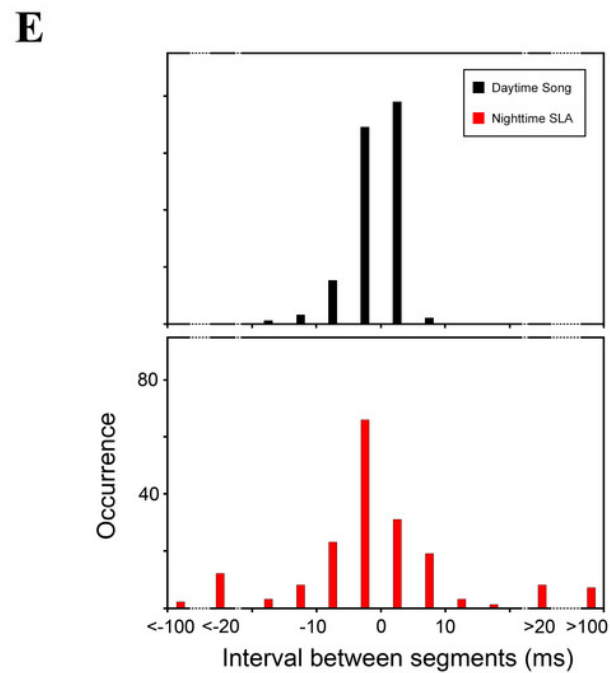
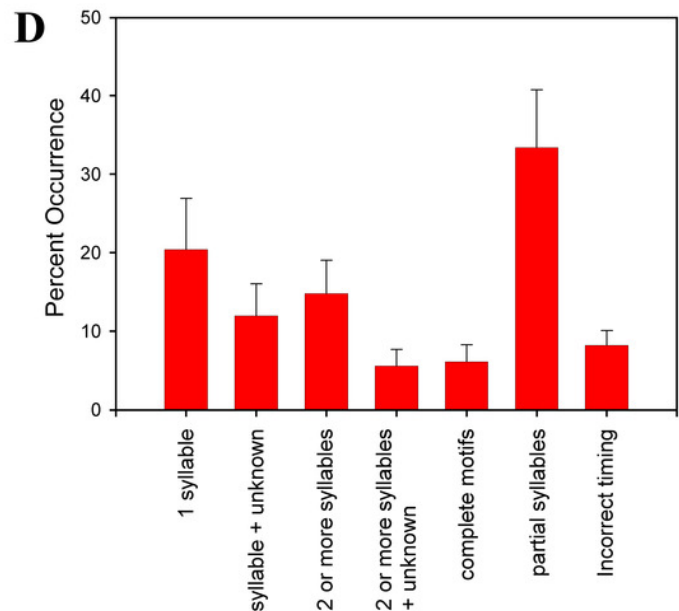
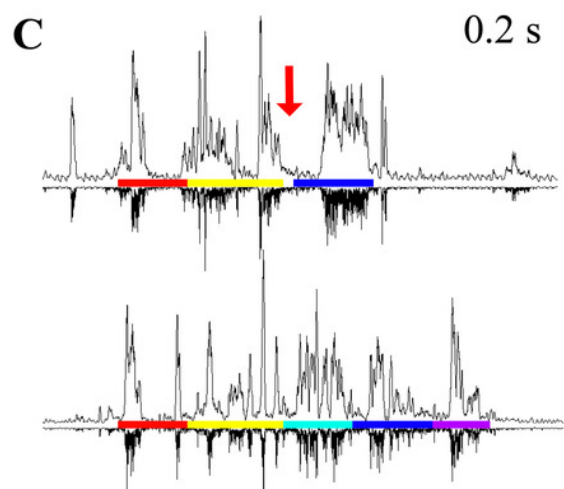
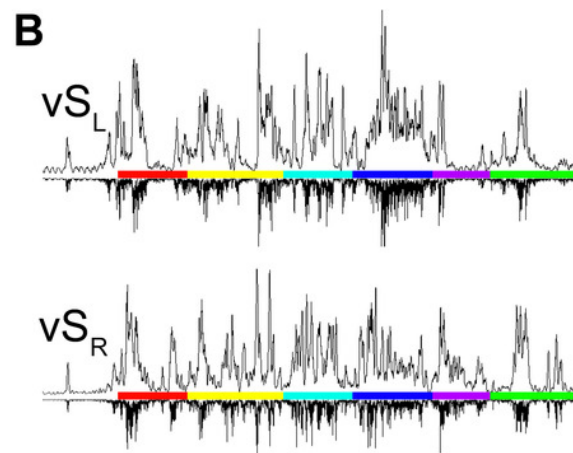
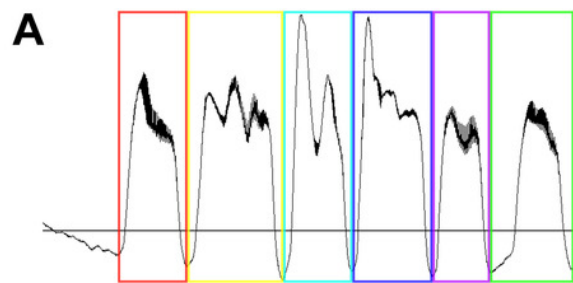


Figure 4

High variability of sequence during night-time activation

Night-time SLA is highly variable compared to activation during song. (A-C) Overlaid traces (different colors) of 15 song motifs illustrate the high stereotypy of song production (A., subsyringeal air sac pressure, B, rectified and integrated EMG of left and right ventral syringeal muscles). During SLA in contrast, EMG patterns in the same muscles are much more variable (20 different occurrences overlaid). (D) Distribution of correlation coefficients for EMG activity around the most frequently produced syllable (black bars) for each bird. The low scores for activity around the target syllable indicate that the full sequence is rarely produced and different syllable patterns are generated at different frequencies. For example, in the first bird syllable 3 is the most frequently produced syllable, and the correlation scores for syllables 4 and 5 show that they are less frequently produced than 1 and 2.

