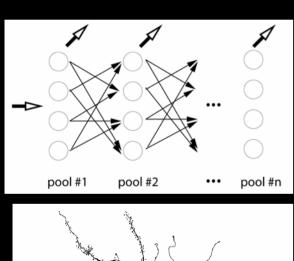
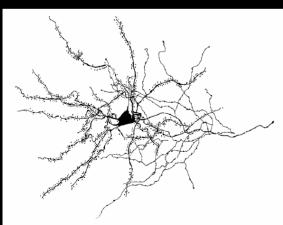
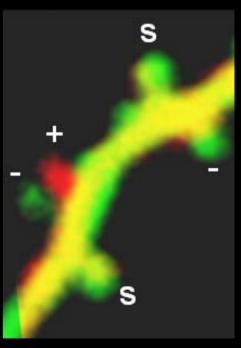
# Three Theoretical Problems Suggested by Recent Bird Song Experiments

Professor Henry Greenside Department of Physics, Duke University









#### Outline

- 1. Mechanism of sequence generation: synfire chains?
- 2. Quantitative connection between song learning and spine growth and decay in HVC?
- 3. Mechanism of LMAN variability engine?

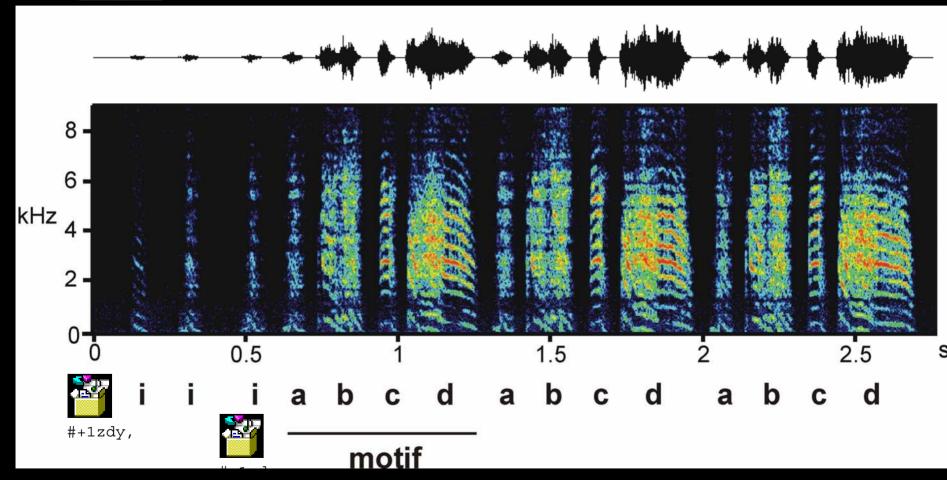
#### Songbirds: Auditory-Guided Vocal Learning



- 1. Sequence memorization, production, motor learning.
- 2. Songbirds inherently motivated to learn conspecific highly stereotyped songs.
- 3. NIH interest: language deficits (stuttering).



### Zebra Finch Temporal Structure: Notes, Syllables, and Motifs

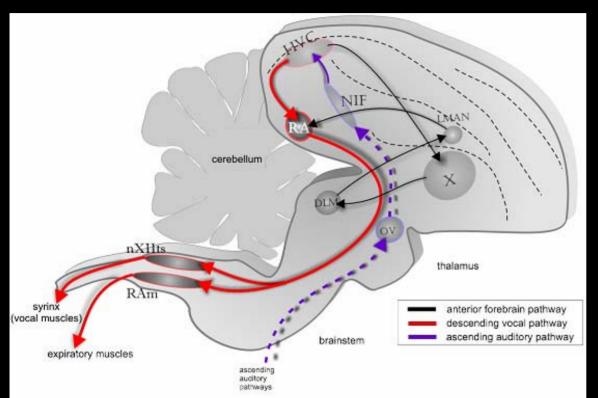


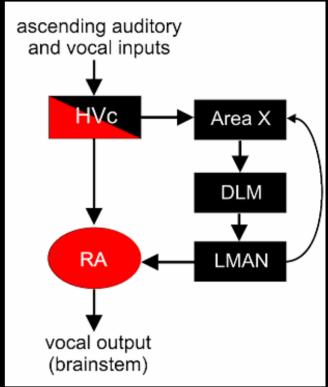
### Sequence Generation Mechanisms

- Asymmetric recursive Hopfield networks (Sompolinsky, Kleinfeld, others).
- Central pattern generator plus delay lines.
- Circular feedforward chains.
- Hierarchical (inter-nuclear) dynamics.

Experimental constraints: Hopfield net not easily consistent with sparse excitatory firing, tonic inhibitory firing. Anatomy?

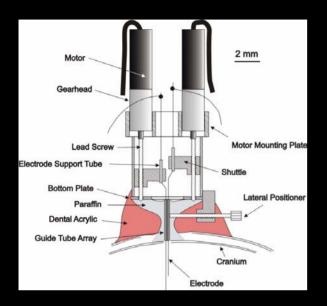
### Nucleus HVc Necessary For Song Production and Learning





Anatomical connections are function of time...

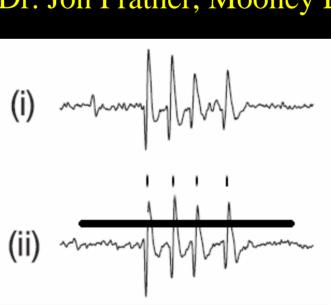
#### Activity of Neurons During Singing



Michale Fee, MIT

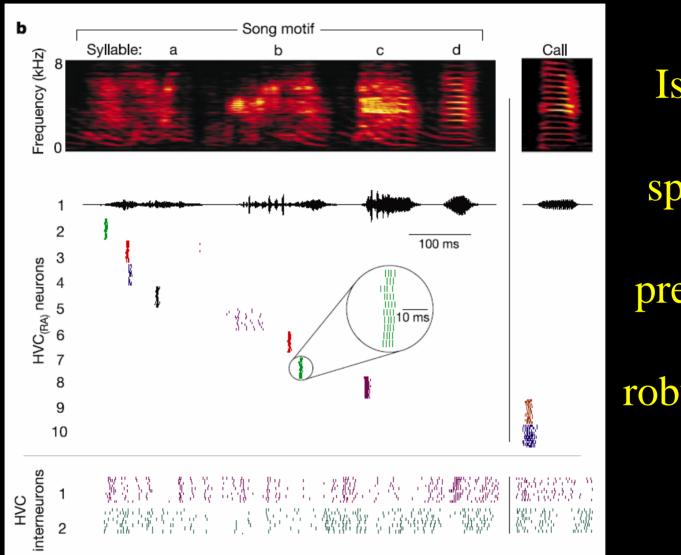


Dr. Jon Prather, Mooney Lab





### Ultra-sparse Bursting of HVC<sub>RA</sub> Neurons During Singing



**Issues:** 

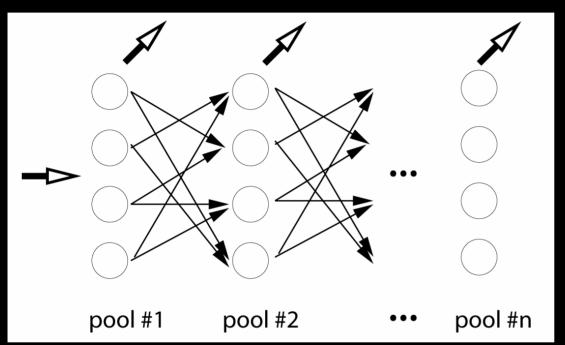
sparsity

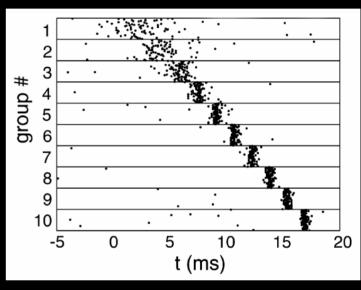
precision

robustness

R. Hahnloser, A. Kozhevnikov, M. Fee Nature 419:65-70 (2002)

### A Possible Simple Explanation: Feedforward Synfire Chain





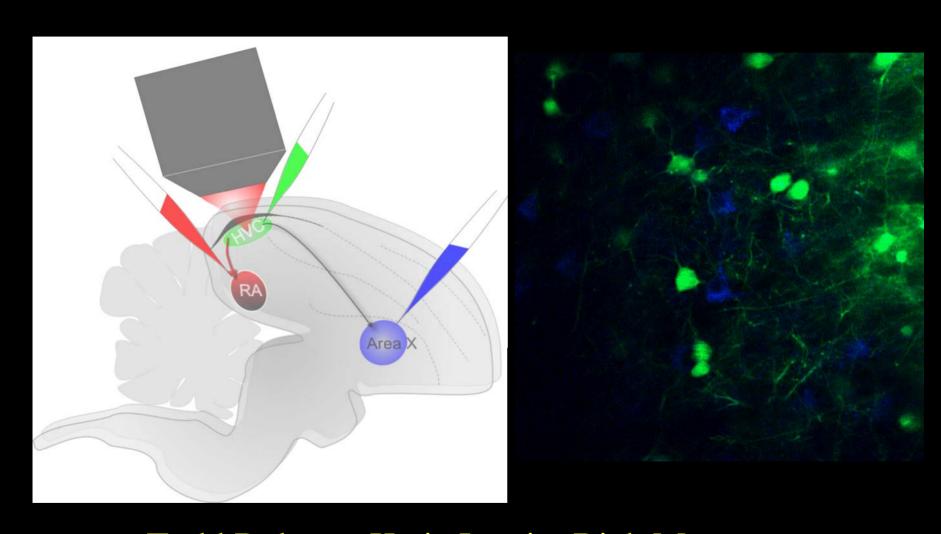
Theoretical support for burst propagation Li and Greenside 2006, Jin, Ramanazaglou, and Seung 2007 but further experiments are needed.

### II: Anatomical Changes During Learning?

- Changes in spine volume (synaptic weight).
- Creation and deletion of spines.
- Apoptosis and neurogenesis.

A big question: can we *quantitatively* understand and so predict anatomical changes in HVC during song learning?

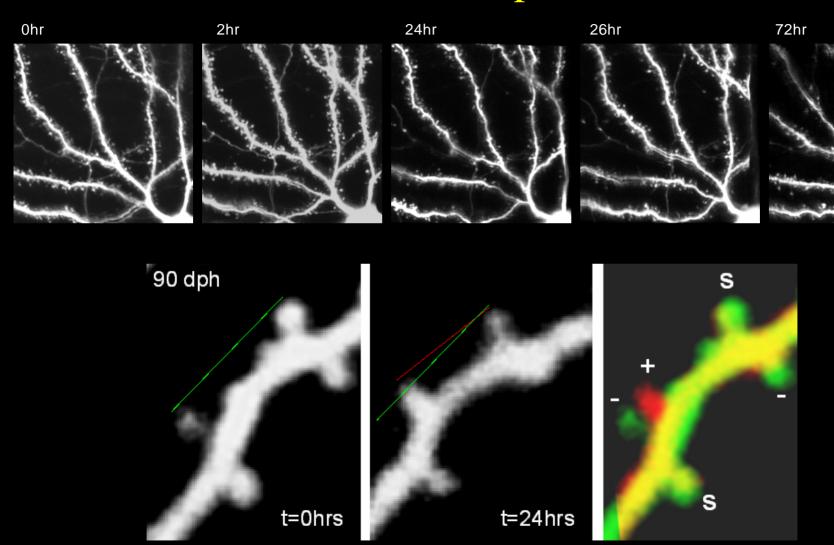
#### Two-Photon Imaging of HVC Neurons In vivo



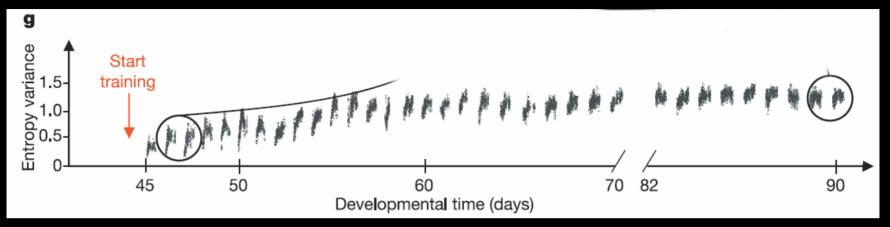
Todd Roberts, Katie Lewin, Rich Mooney (unpublished)

# Longitudinal Two-Photon Imaging of HVC Dendritic Spines *In vivo*

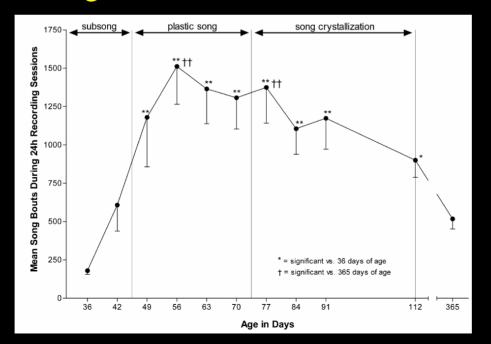
10 μm



### III: Song Learning Complicated Process



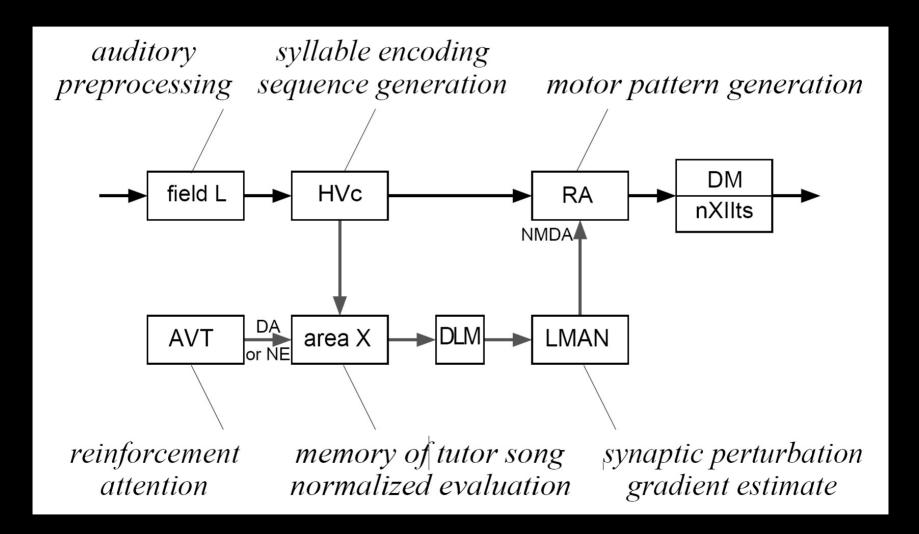
#### S. Deregnaucourt et al, Nature 433:710-716 (2005)



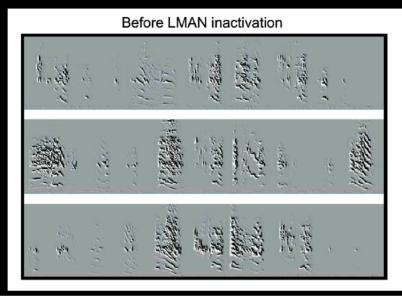
> 50,000 songs to converge

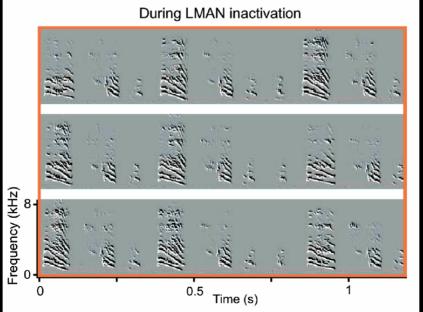
Johnson et al, Behavioral Brain Research 131:57-65 (2002)

### Doya and Sejnowski 1998: Reinforcement Learning Algorithm Plausible



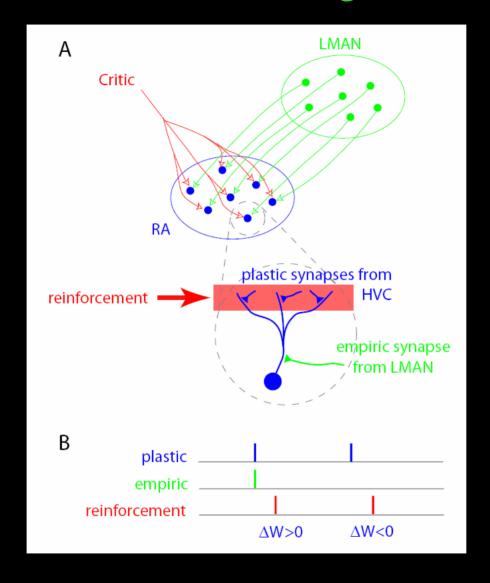
# Inactivating LMAN with TTX Reduces Variability in a Juvenile (57 phd) Zebra Finch





Olveczky et al, PLoS Bio 2005.

#### Reinforcement Learning at Cellular Level



20:1 HVC to LMAN synapses

LMAN: NMDA

HVC: AMPA

LMAN to RA occur before HVC to RA.

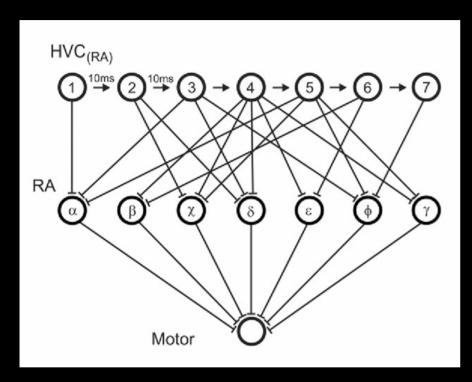
"Model of Birdsong Learning Based on Gradient Estimation by Dynamic Perturbation of Neural Conductances", Fiete, Fee, Seung J. Neurophys. **98**:2038 (2007).

#### How Does LMAN Work?

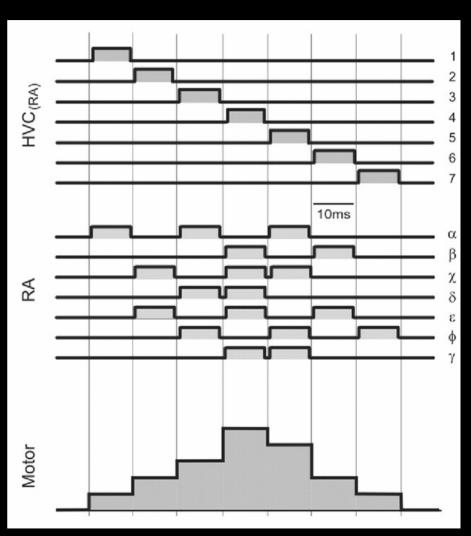
- Can one confirm that birds actually use reinforcement learning? Many hard experimental questions: where is error calculated, what is the reinforcement agent?
- A theoretical step: try to understand how LMAN and HVC synapses interact on dendritic tree of single RA neuron: what are their geometric and physiological relations?

# End of Talk Questions, Discussion?

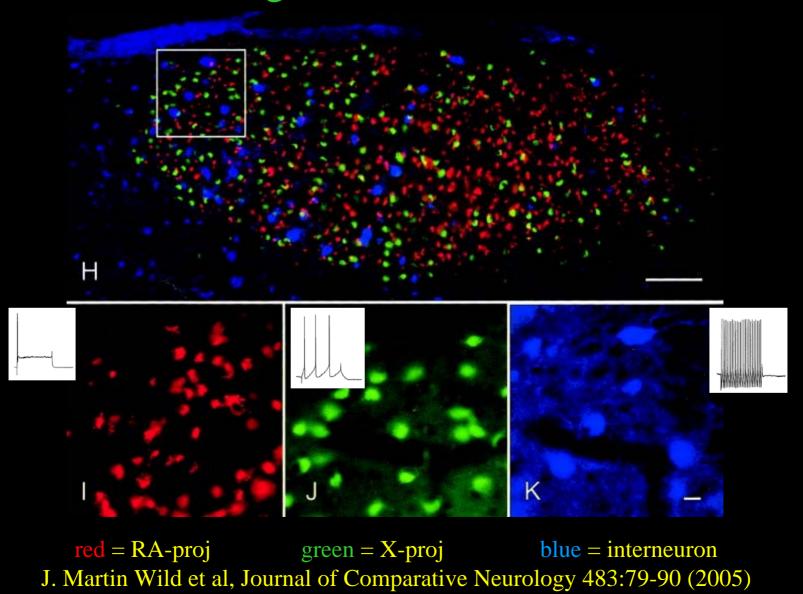
### Hypothesis for Sparseness: HVC<sub>RA</sub> Neurons Form a Feedforward Network



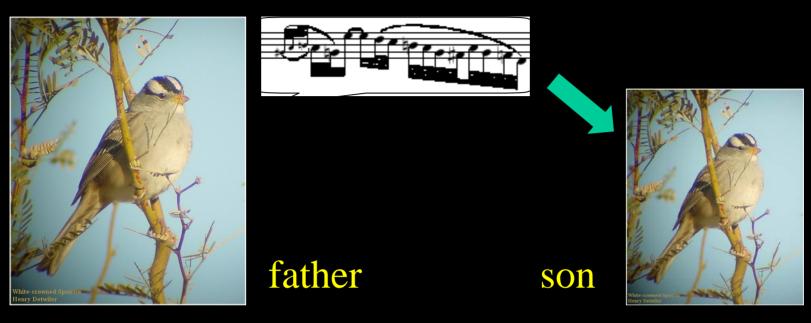
M. Fee, A. Kozhevnikov, R. Hahnloser Annals of the New York Academy of Science 1016: 153–170 (2004).

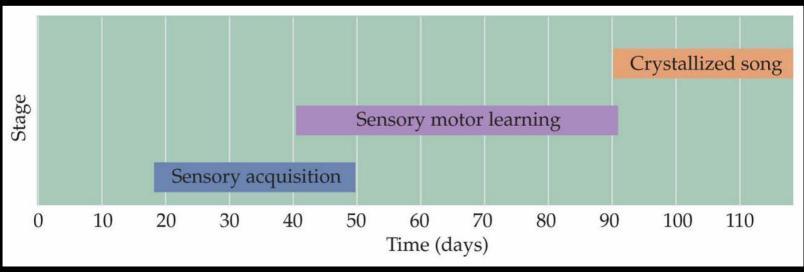


### Anatomical Characterization of Neurons in Songbird Nucleus HVC

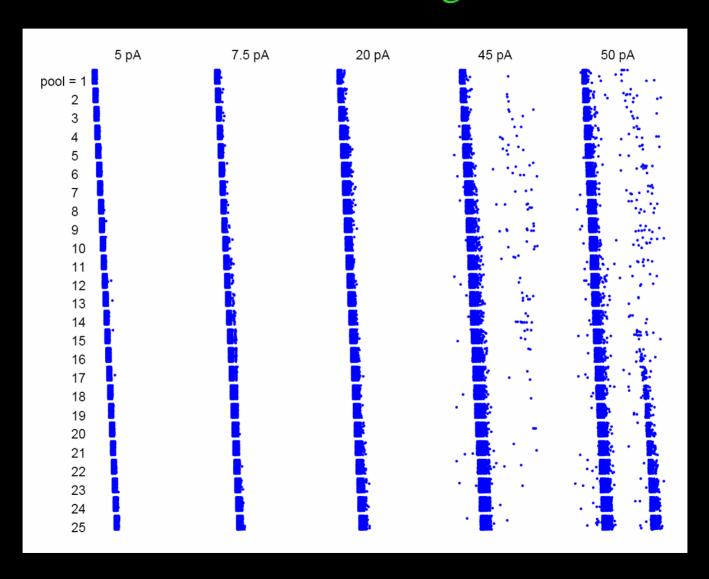


### Three Stages of Song Learning

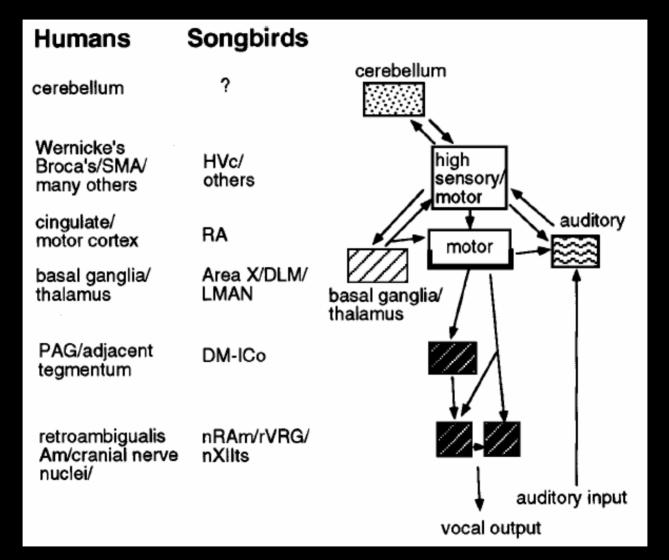




### Bursts Survive High Levels of Noise and Network Heterogeneities

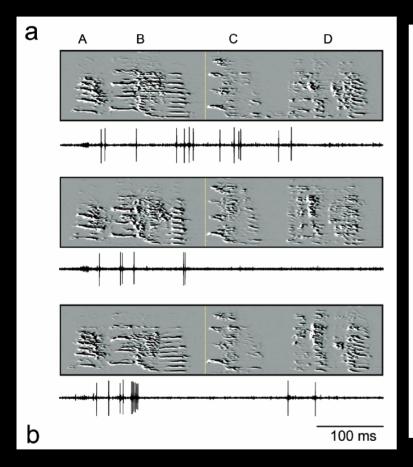


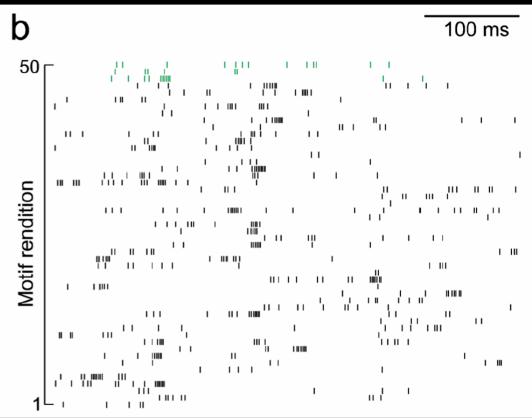
### Human Versus Songbird Anatomy



A. Doupe and P. Kuhl, Ann. Rev. Neurosci 22:567-632 (1999)

### LMAN<sub>RA</sub> Neuronal Firing During Singing Is Highly Variable in Juveniles

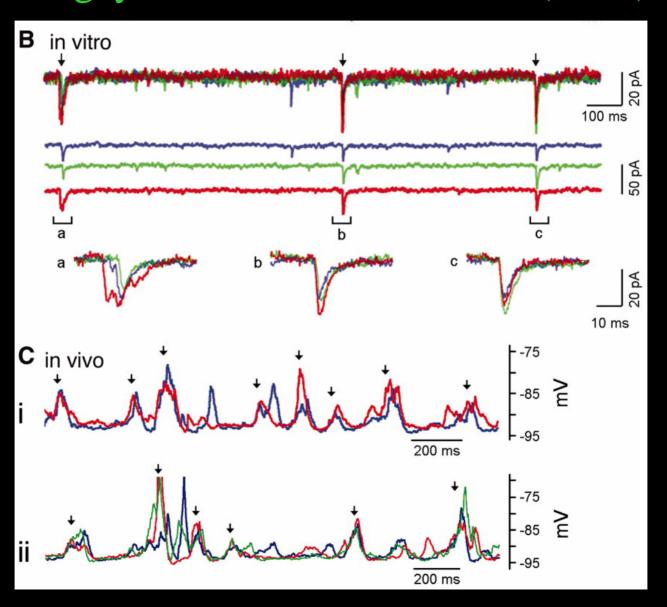




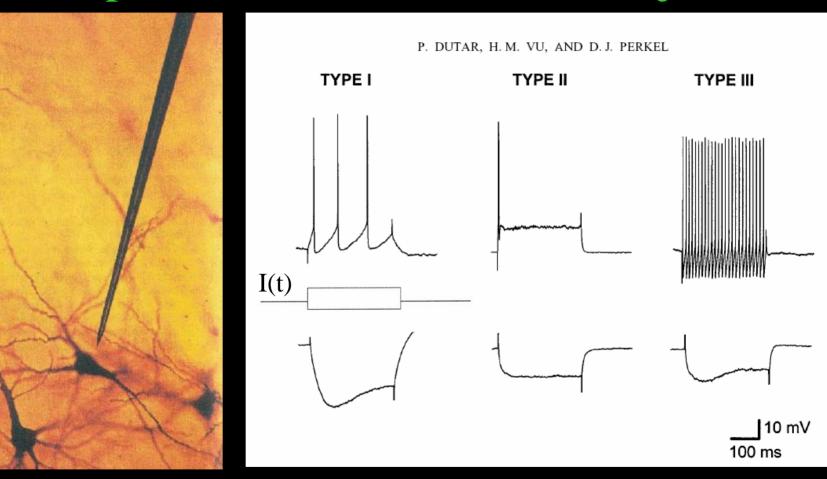
67 days post hatch

Bence P. Olveczky, Aaron S. Andalman, and Michale S. Fee, PLoS Biology 3(5):1-8 (2005) "Vocal Experimentation in the Juvenile Songbird Requires a Basal Ganglia Circuit"

# Precise Reproducible Cortical Dynamics? Ikegaya et al, Nature **304**:559 (2004)

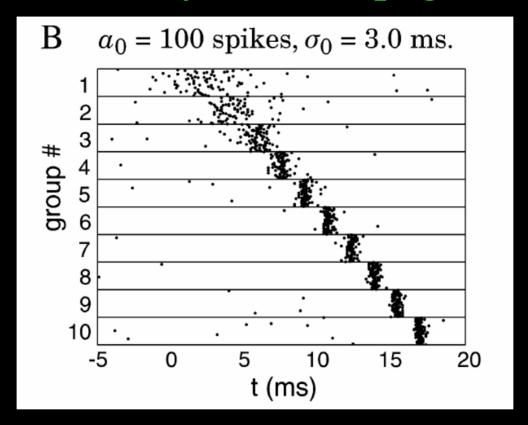


# Characterization of HVC Neurons *in vitro*: Response to Constant Current Injections



P. Dutar et al, Journal of Neurophysiology **80**:1828-1383 (1998) Note: Data obtained from brain slices in immersion chamber.

### Stable Synfire Propagation



"Propagation of cortical synfire activity: survival probability in single trials and stability in the mean"

Marc-Oliver Gewaltig and Markus Diesmann and Ad Aertsen

Neural Networks 14:657-673 (2001)

### What About Bursts in Synfire Chains? Li and Greenside, Jin et al

PHYSICAL REVIEW E 74, 011918 (2006)

Stable propagation of a burst through a one-dimensional homogeneous excitatory chain model of songbird nucleus HVC

MengRu Li and Henry Greenside

10 parameters per neuron for leaky-integrate-and-fire model with simplest synapses.

30 parameters for Hodgkin-Huxley single-compartment neuron with simple synapses.

Extremely difficult to pin down parameters from existing data.

#### Equations

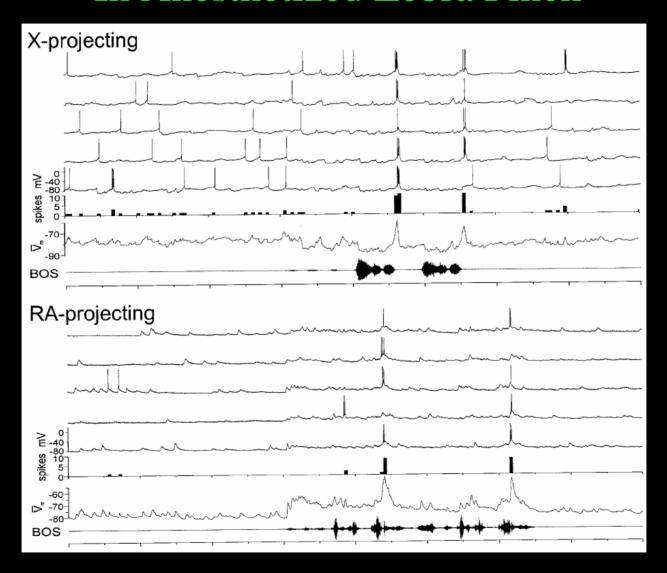
#### Puzzles

• Embedded synfire chain calculations: much harder to achieve stable propagation.

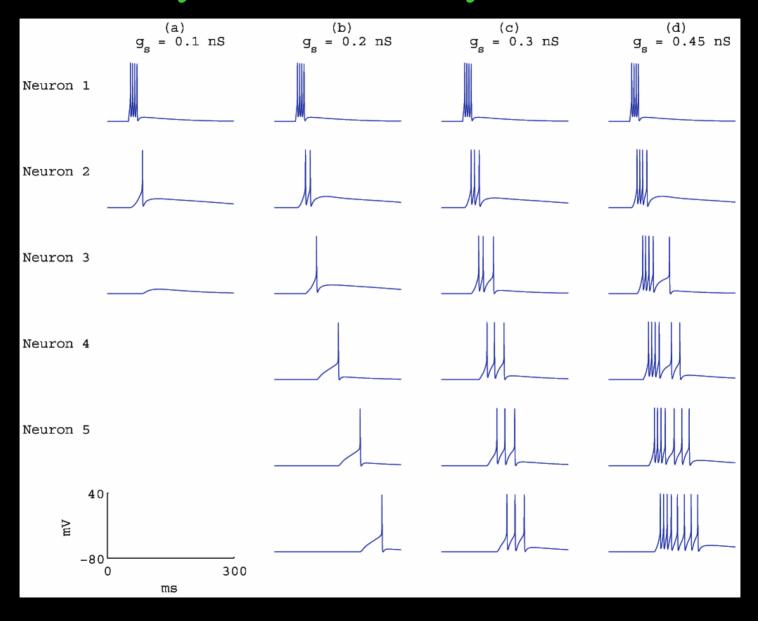
• Songbirds like Bengalese finches have complex "finite state" grammars, hard to reconcile with synfire chains.

• Human speech and recursive Chomskian grammars?

### Sparse Bursting Occurs During Audition In Anesthetized Zebra Finch



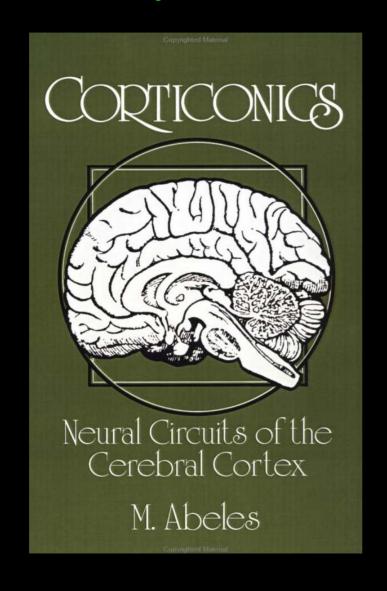
### Stability and Instability of a Burst

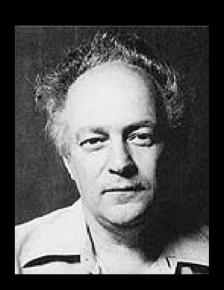


#### Questions

- *Sparse* firing: why do the HVC<sub>RA</sub> fire just once over such a long time interval? Intrinsic and causal or externally driven?
- *Precise* firing: how do the HVC<sub>RA</sub> fire with a reproducible precision of better than 1 ms?
- Robustness: how does precise firing survive neurogenesis in adult HVC?

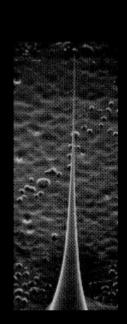
### Synfire Chains, 1991

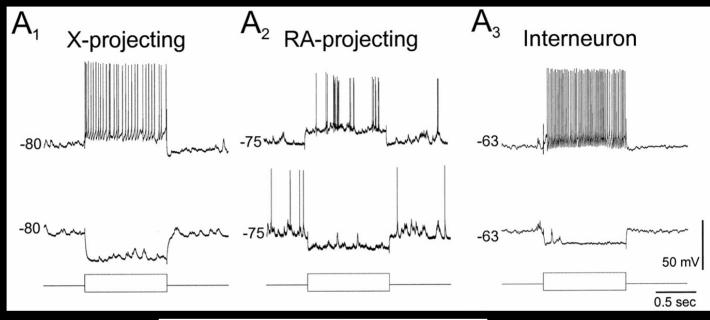


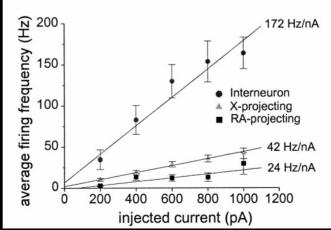


- Robust transmission
- Precise transmission
- Solution to binding...

### In Vivo Intracellular Characterization of HVC Neurons in Anesthetized Bird







Richard Mooney, Journal of Neuroscience 20(14):5420-5436 (2000)