# Cortical Encoding of Auditory Objects at the Cocktail Party

### Jonathan Z. Simon

Department of Biology Department of Electrical & Computer Engineering Institute for Systems Research

University of Maryland

Biology Department Seminar September 20, 2013

### Jonathan Z. Simon Neural processing of speech and complex auditory streams

### Magnetoencephalography







Neural Un-Mixing of Speech



#### Neurally Inspired Algorithms





#### Advanced Neuroimaging



# Acknowledgements

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

NIH R01 DC 008342 NIH R01 DC 007657 NIH R01 DC 005660 NIH R01 DC 000436 NIH R01 AG 036424 NIH R01 AG 027573 NIH R01 EB 004750 NIH R03 DC 004382 USDA 20096512005791

# Acknowledgements

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

#### Funding

NIH R01 DC 008342 NIH R01 DC 007657 NIH R01 DC 005660 NIH R01 DC 000436 NIH R01 AG 036424 NIH R01 AG 027573 NIH R01 EB 004750 NIH R03 DC 004382 USDA 20096512005791

# Acknowledgements

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

#### Funding

NIH R01 DC 008342 NIH R01 DC 007657 NIH R01 DC 005660 NIH R01 DC 000436 NIH R01 AG 036424 NIH R01 AG 027573 NIH R01 EB 004750 NIH R03 DC 004382 USDA 20096512005791

# Introduction

- Magnetoencephalography (MEG)
- Auditory Objects
- Neural Representations of Auditory Objects in Cortex: Decoding
- Neural Representations of Auditory Objects in Cortex: Encoding

### Magnetoencephalography

- Non-invasive, Passive, Silent Neural Recordings
- Simultaneous Whole-Head Recording (~200 sensors)
- Sensitivity
  - high: ~100 fT (10<sup>-13</sup> Tesla)
  - low:  $\sim 10^4 \sim 10^6$  neurons
- Temporal Resolution: ~1 ms
- Spatial Resolution
  - coarse: ~ I cm
  - ambiguous



### Functional Brain Imaging

Hemodynamic techniques

### Functional Brain Imaging

= Non-invasive recording from human brain

Electromagnetic techniques



functional magnetic resonance imaging

**PET** positron emission tomography

> fMRI & MEG can capture effects in single subjects

**EEG** electroencephalography

**MEG** magnetoencephalography









Excellent Spatial Resolution (~1 mm)

Poor Temporal Resolution (~I s)

Poor Spatial Resolution (~I **cm)** 

Excellent Temporal Resolution (~1 ms)

### Functional Brain Imaging

Functional Brain Imaging = Non-invasive recording from human brain

Electromagnetic techniques

Hemodynamic

techniques



Excellent Spatial Resolution (~1 mm)

Poor Temporal Resolution (~1 s)

Poor Spatial Resolution (~I cm)

Excellent Temporal Resolution (~1 ms)

### **Functional Brain Imaging**

**Functional Brain** Imaging = Non-invasive recording from human brain

> Electromagnetic techniques

Hemodynamic

techniques



Spatial Resolution (~I mm) Poor Temporal Resolution

Poor **Spatial** Resolution (~l cm) Excellent Temporal Resolution (~| ms)

# Neural Signals & MEG





Photo by Fritz Goro

- •Direct electrophysiological measurement
  - not hemodynamic
  - •real-time
- •No unique solution for distributed source
- Measures spatially synchronized cortical activity
- •Fine temporal resolution (~ 1 ms)
- •Moderate spatial resolution (~ 1 cm)

### MEG Auditory Field

### Flattened Isofield Contour Map

Instantaneous Magnetic Field



### MEG Auditory Field 3-D Isofield Contour Map



Chait, Poeppel and Simon, Cerebral Cortex (2006)



# MEG = "Squid head"



At the monthly meeting of Squidheads Anonymous







### Time Course of MEG Responses

### **Auditory Evoked Responses**

- MEG Response Patterns Time-Locked to Stimulus Events
- Robust
- Strongly Lateralized



150 r M150 M100 -150 100 0 200 300 150 r M50 N M150 150 100 0 200 300

Pure Tone

**Broadband Noise** 

# Phase-Locking in MEG to Slow Acoustic Modulations



Ding & Simon, J Neurophysiol (2009) Wang et al., J Neurophysiol (2012)

# Phase-Locking in MEG to Slow Acoustic Modulations



MEG activity is precisely phase-locked to temporal modulations of sound

Ding & Simon, J Neurophysiol (2009) Wang et al., J Neurophysiol (2012)



# MEG Responses to Speech Modulations



# MEG Responses Predicted by STRF Model



# Neural Reconstruction of Speech Envelope



# Neural Reconstruction of Speech Envelope



2 s

Ding & Simon, J Neurophysiol (2012) Zion-Golumbic et al., Neuron (2013) Reconstruction accuracy comparable to single unit & ECoG recordings



# Auditory Objects

- What is an auditory object?
  - perceptual construct (not neural, not acoustic)
  - commonalities with visual objects
  - several potential formal definitions

# Auditory Object Definition

- Griffiths & Warren definition:
  - corresponds with something in the sensory world
  - object information separate from information of rest of sensory world
  - abstracted: object information generalized over particular sensory experiences















# Experiments











# Experiments











Ding & Simon, PNAS (2012)

# Speech Stream as an Auditory Object

- corresponds with something in the sensory world
- information separate from information of rest of sensory world
  e.g. other speech streams or noise
- abstracted: object information generalized over particular sensory experiences
  e.g. different sound mixtures

# Neural Representation of an Auditory Object

- neural representation is of something in sensory world
- when other sounds mixed in, neural representation is of auditory object, not entire acoustic scene
- neural representation invariant under broad changes in specific acoustics








# Unselective vs. Selective Neural Encoding





# Unselective vs. Selective Neural Encoding













Identical Stimuli!



**Identical Stimuli!** 

## Single Trial Speech Reconstruction



## Single Trial Speech Reconstruction











-









**Gain-Control Models** 



#### **Gain-Control Models**





#### **Gain-Control Models**







#### **Gain-Control Models Object-Based** correlation 2 attended backarounc -8 -5 8 5 ()Speaker Relative Intensity (dB) Stimulus- Based correlation .2 attended background -8 -5 5 8 0

Speaker Relative Intensity (dB)





Stream-based not stimulus-based
Neural representation is invariant to acoustic changes.

# Neural Representation of an Auditory Object

- ✓ neural representation is of something in sensory world
- ✓ when other sounds mixed in, neural representation is of auditory object, not entire acoustic scene
- ✓ neural representation invariant under broad changes in specific acoustics

#### Forward STRF Model



Spectro-Temporal Response Function (STRF)

#### Forward STRF Model



#### STRF Results



STRF separable (time, frequency)
300 Hz - 2 kHz dominant carriers
M50<sub>STRF</sub> positive peak
M100<sub>STRF</sub> negative peak

#### STRF Results



STRF separable (time, frequency)
300 Hz - 2 kHz dominant carriers
M50<sub>STRF</sub> positive peak
M100<sub>STRF</sub> negative peak



### STRF Results



- STRF separable (time, frequency)
  300 Hz 2 kHz dominant carriers
  M50<sub>STRF</sub> positive peak
- •M100<sub>STRF</sub> negative peak
- •M100<sub>STRF</sub> strongly modulated by attention, *but not M50<sub>STRF</sub>*



## Neural Sources

- •M100<sub>STRF</sub> source near (same as?) M100 source: Planum Temporale
- •M50<sub>STRF</sub> source is anterior and medial to M100 (same as M50?): Heschl's Gyrus



# Cortical Object-Processing Hierarchy



- •M100<sub>STRF</sub> strongly modulated by attention, but not M50<sub>STRF</sub>.
- •M100<sub>STRF</sub> invariant against acoustic changes.
- •Objects well-neurally represented at 100 ms, but not 50 ms.

# Not Just Speech



Elhilali et al., PLoS Biology (2009)







Neural Enhancement for Foreground/Background



### Competing Tone Streams



## Competing Tone Streams



## Competing Tone Streams



# Summary

- Cortical representations of speech found here:
  - consistent with being *neural* representations of auditory (*perceptual*) objects
  - ✓ meet 3 formal criteria for auditory objects
- Object representation fully formed by 100 ms latency (PT), but not by 50 ms (HG)
- Not special to speech
### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

#### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

### **Grad Students**

Francisco Cervantes Alex Presacco Krishna Puvvada

### **Past Grad Students**

Nayef Ahmar Claudia Bonin Maria Chait Marisel Villafane Delgado Kim Drnec Nai Ding Victor Grau-Serrat Ling Ma Raul Rodriguez Juanjuan Xiang Kai Sum Li Jiachen Zhuo

### **Undergraduate Students**

Abdulaziz Al-Turki Nicholas Asendorf Sonja Bohr Elizabeth Camenga Corinne Cameron Julien Dagenais Katya Dombrowski Kevin Hogan Kevin Hogan Kevin Kahn Andrea Shome Madeleine Varmer Ben Walsh

### **Collaborators' Students**

Murat Aytekin Julian Jenkins David Klein Huan Luo

### **Past Postdocs**

Dan Hertz Yadong Wang

### Collaborators

Catherine Carr Monita Chatterjee Alain de Cheveigné Didier Depireux Mounya Elhilali Jonathan Fritz Cindy Moss David Poeppel Shihab Shamma

### Funding

# Integrated Life Sciences & HLSC 374

HONORS O INTEGRA LIFE SCI ABOUT ADMISSIONS ACADE	COLLEGE TED ENCES MICS RESEARCH COMMUNITY PEOPLE FAQS GIVING
Academics	Home / Academics / Courses
Courses	Courses

#### Courses

Majors

Advising

**Pre-Professional Education** 

ILS courses are based on the national initiatives for reforming undergraduate biology education: <u>BIO 2010</u>, <u>Scientific Foundations</u> for Future Physicians, and <u>Vision and Change</u>. These initiatives provide explicit guidelines for designing multidisciplinary life sciences curricula necessary for preparing life science and pre-medical students for successful careers in the 21st century. The ILS academic program is composed of a core of four accelerated courses in integrated organismal biology, genetics and genomics, mathematical modeling in Biology, and scholarship-in-practice, plus the first-semester introduction course. These courses represent either honors versions of BSCI courses or unique new courses



Print

designed to satisfy the objectives of the national initiatives linked above. Furthermore, all ILS courses emphasize innovative pedagogy strategies intended to encourage student active engagement and small-group problem solving.

#### **Course Descriptions**

HLSC 100: Developing Life Scientists for the Global Good (1 credit) - TThis small group, service-learning course provides students with the information needed to develop into professionals in the Life Sciences. Class dialogue focuses on the resources available to students at UMD as well as three important facets of the life sciences: the social determinants of health, sustainability, and STEM education. Students also participate in an ongoing service experience where they work with an organization that focuses on addressing the needs of the local community. (Those students entering ILS as rising second-year students may substitute other UNIV 100 courses to satisfy this requirement.) This course satisfies the freshmen seminar requirement for most majors. Sample Syllabus

HLSC 207 Principles of Biology III: Organismal Biology (3 credits) - This course is recognized as a national model for teaching rigorous introductory organismal biology, since it utilizes mathematical, physical, chemical, genomic, and evolutionary principles to develop an integrated perspective toward the functioning and evolution of all organisms, including humans. This course is equivalent to BSCI 207 <u>Sample Syllabus</u>

HLSC 322 Genetics and Genomics (4 credits) -This course starts with an overview of basic Mendelian and molecular genetics, then focuses on the understanding and application of genomics to contemporary research, medicine, biotechnology, and societal issues. This course is equivalent to BSCI 222 Sample Syllabus

HLSC 374 Mathematical Modeling in Biology(4 credits) - This course is designed specifically to teach students how to apply advanced mathematics and modeling techniques in order to: 1) address important problems in human physiology, epidemiology, and complex biological systems, and 2) do research in emerging disciplines, such as molecular biophysics and bioinformatics. NOTE: The prerequisite for this course is two semesters of Calculus or the equivalent AP credits. This course is equivalent to BSC1474 <u>Sample Syllabus</u>

HLSC 374: Mathematical Modeling in Biology

"Models are chosen from a variety of biological disciplines, including biological population dynamics, infectious disease models, molecular evolution models, and phylogenetic tree construction."

Looking for Guest Lecturer!

### Thank You



At the monthly meeting of Squidheads Anonymous







# Reconstruction of Same-Sex Speech



## Speech in Noise: Stimuli



# Speech in Noise: Results



# Speech in Noise: Results



### Speech in Noise: Results

