How the Brain Solves the Cocktail Party Problem: Evidence from Human Auditory Neuroscience

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Shameless Plug

Springer Handbook of Auditory Research

John C. Middlebrooks Jonathan Z. Simon Arthur N. Popper Richard R. Fay *Editors*

The Auditory System at the Cocktail Party



Description Springer

Valuable Resource

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The Auditory System at the Cocktail Party





Chapter 7 Human Auditory Neuroscience and the Cocktail Party Problem

Jonathan Z. Simon

Abstract Experimental neuroscience using human subjects, to investigate how the auditory system solves the cocktail party problem, is a young and active field. The use of traditional neurophysiological methods is very tightly constrained in human subjects, but whole-brain monitoring techniques are considerably more advanced for humans than for animals. These latter methods in particular allow routine recording of neural activity from humans while they perform complex auditory tasks that would be very difficult for animals to learn. The findings reviewed in this chapter cover investigations obtained with a variety of experimental methodologies, including electroencephalography, magnetoencephalography, electrocorticography, and functional magnetic resonance imaging. Topics covered in detail include investigations in humans of the neural basis of spatial hearing, auditory stream segregation of simple sounds, auditory stream segregation of speech, and the neural role of attention. A key conceptual advance noted is a change of interpretational focus from the specific notion of attention-based neural gain, to the general role played by attention in neural auditory scene analysis and sound segregation. Similarly, investigations have gradually changed their emphasis from explanations of how auditory representations remain faithful to the acoustics of the stimulus, to how neural processing transforms them into new representations corresponding to the percept of an auditory scene. An additional important methodological advance has been the successful transfer of linear systems theory analysis techniques commonly used in single-unit recordings to whole-brain noninvasive recordings.

Keywords Attentional gain · Auditory scene analysis · Binaural integration · Electrocorticography · Electroencephalography · Functional magnetic resonance imaging · Heschl's gyrus · Human auditory system · Interaural level difference · Interaural time difference · Magnetoencephalography · Maskers · Planum temporale · Positron emission tomography · Selective attention · Speech · Superior temporal gyrus

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Outline

- What is the Cocktail Party Problem?
- What is Human Auditory Neuroscience?
- Cocktail Parties, Simplified:
 - Tones—with and without directed Attention
 - Speech
- Recent Results: Perceptual & Neural Filling-In

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Inter-related Processes

- The Cocktail Party Problem
 - Multiple speech streams (sources)
- Auditory Scene Analysis
 - Auditory objects
- Stream Segregation
 - Segregation / Identification / Formation
- Related Concepts, e.g., Filling-In

Cocktail Party Cues

- Sound source location
- Pitch (f0) [when it exists]
- Timbre (spectral envelope, vibrato, ...)
- Speaker sex, age, accent, language, ...
- Derived not Intrinsic
 - not clear how a cue is reconstructed when sounds linearly mixed in a complex scene
- Number of sources also must be derived
- Statistics of a speech stream (or other source)

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Functional Brain Imaging

Hemodynamic techniques

Functional Brain Imaging = Non-invasive recording from human brain

Electromagnetic techniques

fMRI functional m

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 (~1 s)

Poor Spatial Resolution (~1 cm)

Excellent Temporal Resolution (~I ms)

Invasive Recording Methods ECoG Depth Electrodes







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Foundational Evidence



- Simple Auditory Scene
 - Separate tone-pip streams in each ear (dichotic)
 - Attend to one stream only

Hillyard et al (1973)

Foundational Evidence



• Simple Auditory Scene

- Separate tone-pip streams in each ear (dichotic)
- Attend to one stream only
- Strong EEG N1 Responses
 - (Negative peak with ~100 ms latency)
- Enhanced N1 amplitudes for attended (foreground) stream
- Historically: Neural Correlate of Selective Attention
- Better(?): Neural Correlate of Successful Auditory Scene Segregation

Hillyard et al (1973)

Simple Complex Scenes

- Remove spatial information (diotic only)
 - Spatial information Useful but not Necessary
 - not Fundamental
- Other cue(s) still needed

Simple Complex Scenes (I)

- No attentional manipulation
 - Tone-based (no speech)
 - Ambiguous auditory scene
 - Distinct percepts despite single stimulus
 - Avoid confound of stimulus-dependent percept

van Noorden streams



adapted from Steele et al (2015)

• One stimulus, Two percepts

van Noorden (1975)

Neural Measures of Perception



- Segregation increases with frequency separation
- MEG PIm and NIm increase with frequency separation & segregation
- For constant frequency separation, PIm and NIm increase if perceptually segregated
- Neural measure follows perception, not (just) physical acoustics
- Additional dissociation between neural measures and stimulus in EEG by Snyder et al (2006)
- ECoG also by Dykstra et al (2011)

Neural Measures of Perception: fMRI & PET

- Neural measures that track a percept are more difficult to see with fMRI & PET
 - Even when stimulus manipulated too
- Most effects seen only *outside* of auditory cortex
 - Only in intraparietal sulcus for Cusack (2005), varying the frequency separation
 - EEG & MEG results dominated by responses from auditory cortex
 - ABAB or ABBB patterns work better with fMRI, perhaps by avoiding habituation

Informational Masking Tone Clouds





modified from Kidd et al (2003)

• MEG respones to individual tones





Absent when not detected



Gutschalk et al (2008)

Undetected targets



- MEG respones to individual tones
 - Absent when not detected
 - Present when detected





- MEG respones to individual tones
- Absent when not detected
- Present when detected
- Origin in Auditory Cortex (Planum Temporale)
- Auditory Response linked to percept not acoustics
- fMRI results do not completely agree: widespread activation across auditory cortex, with perceptual contrast only in Heschl's Gyrus [Wiegand and Gutschalk (2012)]

Neural Measures of Perception

- Multiple cortical representations of the sounds present in an acoustic scene.
- Some determined more by the percept of a sound than its acoustics (typically later representations in higher-order auditory cortex: Planum Temporale)
- Some neural measures track (or perhaps more likely, precede) the percept of the sound

Simple Complex Scenes (II)

- Now with attentional manipulation
 - Still tone-based (no speech)
 - Still ambiguous auditory scene
 - Distinct percepts despite single stimulus
 - Avoid confound of stimulus-dependent percept
 - Directed attention determines percept (mostly)



Attention Always On

Elhilali et al. PLoS (2009)





Attention Always On

Elhilali et al. PLoS (2009)



Attention Always On

Elhilali et al. PLoS (2009)






Neural Measures of Perception

- Direction of auditory attention influences both percept and neural response
- Robust effect
- Both bottom-up and top-down
- Temporal build-up (over seconds) for both percept and neural response



Xiang et al. (2010)









see also Bidet-Caulet et al. (2007) with depth electrodes at 21 and 29 Hz

Neural Measures of Perception

- Closer to Cocktail Party
- Direction of auditory attention still influences both percept and neural response
- Still temporal build-up (over seconds) for both percept and neural response

Suppressive Attention / Active Ignoring

Neural dynamics of attending and ignoring in human auditory cortex

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^c Psychology and Neural Science, New York University, New York, NY, USA

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^e Department of Biology, University of Maryland, College Park, MD, USA

"[We] provide new, direct evidence that listeners **actively ignoring a sound** can **reduce their stimulus related activity** in auditory cortex by **100 ms** after onset when this is required to execute specific behavioral objectives."

Simple Complex Scenes Summary

- Experiments all tone-based (speech not needed)
- Neural responses can dissociate from physical acoustics, tracking perception instead
- Latency of responses tracking perception
 ~100 ms plausible neural substrate of perception
- Different roles available for Attention
 - directed vs. undirected
 - bottom-up vs. top-down

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Speech

• Recent Results: Perceptual & Neural Filling-In





Frequency (kHz)

0.5

1.5

Time (s)

2.5

3

2









from Shinn-Cunningham et al. (2017), Chapter 2: "Auditory Object Formation and Selection"

MEG Speech Responses Predicted by STRF



MEG Speech Responses Predicted by STRF



Neural Reconstruction of Speech Envelope



Neural Reconstruction of Speech Envelope



^{2 s} Ding & Simon, J Neurophysiol (2012) Zion-Golumbic et al. (2013)

Reconstruction accuracy comparable to single unit & ECoG recordings



Neural Encoding of Speech



Selective Neural Encoding of Speech





Unselective vs. Selective Neural Encoding





Selective Neural Encoding









Selective Encoding: Results



Identical Stimuli!

Ding & Simon, PNAS (2012)

Single Trial Speech Reconstruction



Single Trial Speech Reconstruction

















- Neural representation invariant to relative loudness change
- Stream-based Gain Control, not stimulus-based

Ding & Simon, PNAS (2012)

Reconstruction of Same-Sex Speech



Ding & Simon, PNAS (2012)

Forward STRF Model



Spectro-Temporal Response Function (STRF)

Forward STRF Model




- STRF separable (time, frequency)
 300 Hz 2 kHz dominant carriers
 M50_{STRF} positive peak
- •M100_{STRF} negative peak

Ding & Simon, PNAS (2012)



Ding & Simon, PNAS (2012)



- STRF separable (time, frequency)
 300 Hz 2 kHz dominant carriers
- •M50_{STRF} positive peak
- •M100_{STRF} negative peak
- •M100_{STRF} strongly modulated by attention, but not M50_{STRF} Ding & Simon, PNAS (2012)





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See also Power et al (2012) for EEG

Neural Sources

- •M100_{STRF} source indistinguishable from M100 source: *Planum Temporale*
- •M50_{STRF} source is anterior and medial to M100: *Heschl's Gyrus*
- •PT strongly modulated by attention, *but not HG*

Ding & Simon, PNAS (2012)



Cortical Processing of Auditory Objects



- •M100_{STRF} strongly modulated by attention, but not M50_{STRF}.
- •M100_{STRF} invariant against acoustic changes.
- •Objects well-neurally represented at 100 ms, but not 50 ms.
- Ding & Simon, PNAS (2012)



- ECoG records from tens of independent sources
- Reconstruction possible for entire spectrogram (not just temporal envelope)



- ECoG records from tens of independent sources
- Reconstruction possible for entire spectrogram (not just temporal envelope)





- ECoG records from tens of independent sources
- Reconstruction possible for entire *spectrogram* (not just temporal envelope)





- ECoG records from tens of independent sources
- Reconstruction possible for entire *spectrogram* (not just temporal envelope)
- Neural measure follows perception, not (just) physical acoustics
- Reconstruction success only in successful trials
- No consistent spatial pattern observed over auditory cortex



- ECoG over auditory and non-auditory cortex (e.g., motor)
- Neural measures include High Gamma envelope (just seen) and Low Frequency (Delta and Theta band) responses
 - Low Frequency responses also used in MEG, EEG, and LFP
- Neural measure follows perception

Zion Golumbic et al. (2013)



- Reconstruction success from auditory and nonauditory cortex (e.g., motor), for single, foreground, and background speech
- Low Frequency (c.f. LFP) representations more widespread than High Gamma, especially in non-auditory areas
 - Not due to "return" currents

Zion Golumbic et al. (2013)

Neuroanatomy of Speech in Noise

- ECoG studies show widespread representations of speech in a noisy background, across all of, and beyond, auditory cortex (but limited in anatomical scope)
- fMRI & PET show even greater diversity of (nonphase-locked) activity from processing of speech in a noisy background
 - Bilateral activation of auditory cortex

Throughout prefrontal and parietal cortex Scott & McGettigan (2013)

Top-Down vs. Bottom Up Attention

Investigating bottom-up auditory attention

Emine Merve Kaya and Mounya Elhilali*

Department of Electrical and Computer Engineering, The Johns Hopkins University, Baltimore, MD, USA

"Predictions from the model corroborate the relationship between **bottom-up auditory attention and statistical inference**, and argues for a potential **role of predictive coding** as mechanism for saliency detection in acoustic scenes."

Evidence for Models of Segregation

- Temporal Coherence
- See Shamma seminar

Elhilali et al. Nat Neurosci (2009)

O'Sullivan et al. (2015)

Direction of Directed Attention?

Attentional Selection in a Cocktail Party Environment Can Be Decoded from Single-Trial EEG

James A. O'Sullivan¹, Alan J. Power^{1,2}, Nima Mesgarani^{3,4}, Siddharth Rajaram⁵, John J. Foxe⁶, Barbara G. Shinn-Cunningham⁵, Malcolm Slaney⁷, Shihab A. Shamma⁸ and Edmund C. Lalor¹

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"Despite the fact that we used unaveraged EEG, and did not correct for muscle or blink artifacts, we were able to **classify attention** accurately on a **single-trial basis**. ... [with] decoding accuracy of 82%–89%."

Attentional Dynamics



- Simple dynamical model of neural correlate of attentional direction
- Time resolution ~5 s (not, e.g., 60 s)

Akram et al. Neurolmage (2016)

Attentional Dynamics



- Simple dynamical model of neural correlate of attentional direction
- Time resolution ~5 s (not, e.g., 60 s)
- Less conservative in assumptions regarding actual subject behavior

Akram et al. Neurolmage (2016)

Attentional Dynamics



- Simple *dynamical* model of neural correlate of attentional direction
- Time resolution ~5 s (not, e.g., 60 s)
- Less conservative in assumptions regarding actual subject behavior
- Observable attentional (neural) dynamics

Akram et al. Neurolmage (2016)

TRF Dynamics



- Dynamical model entire TRF, including attentional modulation
- Time resolution still
 ~5 s





- Unfamiliarity of Background
 - Boosts Intelligibility of Attended Speech



- Unfamiliarity of
 Background
 - Boosts Intelligibility of Attended Speech



- Unfamiliarity of Background
 - Boosts Intelligibility
 - of Attended Speech



- Unfamiliarity of Background
 - Boosts Intelligibility of Attended Speech
 - Also Boosts Cortical Reconstruction of Attended Speech

Simple Speech Mixtures Summary

- Speech separation works too (not just tones)
 - strict frequency segregation not necessary
- Neural responses can dissociate from physical acoustics, tracking perception instead
- Strong preference for foreground speech at ~100 ms (in Planum Temporale), so plausibly a neural substrate of perception
- Processing hierarchy: no attentional preference at ~50 ms (in Heschl's Gyrus)

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Perceptual Filling-In / Restoration

- Perceptual Phenomenon
- Acoustically absent but plausibly masked stimulus can nonetheless be heard
- Strong percept for constant frequency tones
- Also occurs at phonemic level



based on Bregman (1990)



Typical Responses man

But perception does not always follow from acoustics

Stimulus Response	Rhythmic	Non- rhythmic
Rhythmic	Driven	Filling-in
Non- rhythmic	Missed	Absent



Stimulus Response	Rhythmic	Non- rhythmic
Rhythmic	Driven	Filling-in
Non- rhythmic	Missed	Absent









Summary

- Auditory (neural) representations of acoustic stimuli and of perceived stimuli are related but separable
 - There seem to exist neural representations of perceptual objects, especially auditory foreground (e.g., in Planum Temporale, ~100 ms)
- Robust Dynamical Foreground Monitoring
- The concept of "attentional modulation" of neuronal responses is *misleading* and *likely counter-productive*
References & Resources

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Thank You