

REPORT DOCUMENTATION PAGE			Form Approved OMB NO. 0704-0188		
<p>The public reporting burden for this collection of information is estimated to average 1 hour per response, including the time for reviewing instructions, searching existing data sources, gathering and maintaining the data needed, and completing and reviewing the collection of information. Send comments regarding this burden estimate or any other aspect of this collection of information, including suggestions for reducing this burden, to Washington Headquarters Services, Directorate for Information Operations and Reports, 1215 Jefferson Davis Highway, Suite 1204, Arlington VA, 22202-4302. Respondents should be aware that notwithstanding any other provision of law, no person shall be subject to any penalty for failing to comply with a collection of information if it does not display a currently valid OMB control number.</p> <p>PLEASE DO NOT RETURN YOUR FORM TO THE ABOVE ADDRESS.</p>					
1. REPORT DATE (DD-MM-YYYY) 13-12-2012		2. REPORT TYPE Final Report		3. DATES COVERED (From - To) 15-Mar-2012 - 14-Dec-2012	
4. TITLE AND SUBTITLE Final Report			5a. CONTRACT NUMBER W911NF-12-1-0109		
			5b. GRANT NUMBER		
			5c. PROGRAM ELEMENT NUMBER 611102		
6. AUTHORS Gerwin Schalk, Ph.D.			5d. PROJECT NUMBER		
			5e. TASK NUMBER		
			5f. WORK UNIT NUMBER		
7. PERFORMING ORGANIZATION NAMES AND ADDRESSES Health Research, Inc. @ Wadsworth Health Research, Inc./NYSDOH Riverview Center Menands, NY 12204 -2719			8. PERFORMING ORGANIZATION REPORT NUMBER		
9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES) U.S. Army Research Office P.O. Box 12211 Research Triangle Park, NC 27709-2211			10. SPONSOR/MONITOR'S ACRONYM(S) ARO		
			11. SPONSOR/MONITOR'S REPORT NUMBER(S) 60779-LS-II.1		
12. DISTRIBUTION AVAILABILITY STATEMENT Approved for Public Release; Distribution Unlimited					
13. SUPPLEMENTARY NOTES The views, opinions and/or findings contained in this report are those of the author(s) and should not be construed as an official Department of the Army position, policy or decision, unless so designated by other documentation.					
14. ABSTRACT Understanding the functional connectivity of the brain is of substantial importance for basic and translational neuroscience, but existing techniques to derive this functional connectivity have important limitations. The goal of this proposed project is to develop methods that support direct and objective assessment of functional connectivity in high-resolution electrophysiological brain signals. The objective is to provide the methodological basis for construction of the most detailed functional connectivity maps generated to date.					
15. SUBJECT TERMS functional connectivity, ECoG, electrocorticography					
16. SECURITY CLASSIFICATION OF:		17. LIMITATION OF ABSTRACT UU	15. NUMBER OF PAGES	19a. NAME OF RESPONSIBLE PERSON Gerwin Schalk	
a. REPORT UU	b. ABSTRACT UU			c. THIS PAGE UU	19b. TELEPHONE NUMBER 518-486-2559

Report Title

Final Report

ABSTRACT

Understanding the functional connectivity of the brain is of substantial importance for basic and translational neuroscience, but existing techniques to derive this functional connectivity have important limitations. The goal of this proposed project is to develop methods that support direct and objective assessment of functional connectivity in high-resolution electrophysiological brain signals. The objective is to provide the methodological basis for construction of the most detailed functional connectivity maps generated to date.

Enter List of papers submitted or published that acknowledge ARO support from the start of the project to the date of this printing. List the papers, including journal references, in the following categories:

(a) Papers published in peer-reviewed journals (N/A for none)

<u>Received</u>	<u>Paper</u>
-----------------	--------------

TOTAL:

Number of Papers published in peer-reviewed journals:

(b) Papers published in non-peer-reviewed journals (N/A for none)

<u>Received</u>	<u>Paper</u>
-----------------	--------------

TOTAL:

Number of Papers published in non peer-reviewed journals:

(c) Presentations

Number of Presentations: 1.00

Non Peer-Reviewed Conference Proceeding publications (other than abstracts):

Received Paper

TOTAL:

Number of Non Peer-Reviewed Conference Proceeding publications (other than abstracts):

Peer-Reviewed Conference Proceeding publications (other than abstracts):

Received Paper

TOTAL:

Number of Peer-Reviewed Conference Proceeding publications (other than abstracts):

(d) Manuscripts

Received Paper

TOTAL:

Number of Manuscripts:

Books

Received Paper

TOTAL:

Patents Submitted

Patents Awarded

Awards

Graduate Students

<u>NAME</u>	<u>PERCENT SUPPORTED</u>
FTE Equivalent:	
Total Number:	

Names of Post Doctorates

<u>NAME</u>	<u>PERCENT SUPPORTED</u>
Jeremy Hill	1.00
FTE Equivalent:	1.00
Total Number:	1

Names of Faculty Supported

<u>NAME</u>	<u>PERCENT SUPPORTED</u>	National Academy Member
Gerwin Schalk	0.05	
FTE Equivalent:	0.05	
Total Number:	1	

Names of Under Graduate students supported

<u>NAME</u>	<u>PERCENT SUPPORTED</u>
FTE Equivalent:	
Total Number:	

Student Metrics

This section only applies to graduating undergraduates supported by this agreement in this reporting period

- The number of undergraduates funded by this agreement who graduated during this period: 0.00
- The number of undergraduates funded by this agreement who graduated during this period with a degree in science, mathematics, engineering, or technology fields:..... 0.00
- The number of undergraduates funded by your agreement who graduated during this period and will continue to pursue a graduate or Ph.D. degree in science, mathematics, engineering, or technology fields:..... 0.00
- Number of graduating undergraduates who achieved a 3.5 GPA to 4.0 (4.0 max scale):..... 0.00
- Number of graduating undergraduates funded by a DoD funded Center of Excellence grant for Education, Research and Engineering:..... 0.00
- The number of undergraduates funded by your agreement who graduated during this period and intend to work for the Department of Defense 0.00
- The number of undergraduates funded by your agreement who graduated during this period and will receive scholarships or fellowships for further studies in science, mathematics, engineering or technology fields: 0.00

Names of Personnel receiving masters degrees

NAME

Total Number:

Names of personnel receiving PHDs

NAME

Total Number:

Names of other research staff

NAME

PERCENT SUPPORTED

FTE Equivalent:

Total Number:

Sub Contractors (DD882)

Inventions (DD882)

Scientific Progress

Technology Transfer

Title: Methods for Functional Connectivity Analyses

PI: Gerwin Schalk, Ph.D.

Project Abstract (from application)

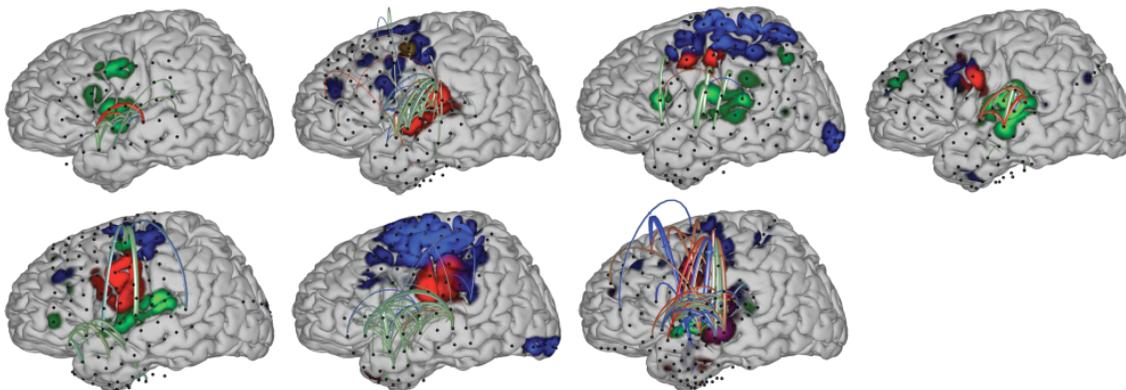
Understanding the functional connectivity of the brain is of substantial importance for basic and translational neuroscience, but existing techniques to derive this functional connectivity have important limitations. The goal of this proposed project is to develop methods that support direct and objective assessment of functional connectivity in high-resolution electrophysiological brain signals. The objective is to provide the methodological basis for construction of the most detailed functional connectivity maps generated to date.

Project Summary

Our entry point to the project was a dataset of electrocorticographic (ECoG) activity that were recorded while seven people listened to music, a complex auditory stimulus. We set out to develop methods that could accurately establish those functional brain connections that were related to processing of the auditory stimulus.

For a particular set of two brain signal features, functional connectivity can in principle be readily established using existing techniques such as Granger causality. These techniques then need to be applied to all combinations of brain signal features. Because there are usually thousands of such combinations of brain signal features, this raises significant problems of with multiple comparisons. Moreover, extraction of ECoG features and application of Granger causality itself depends on a number of assumptions that are usually violated with brain signals. While all of these issues are well known in their respective fields of statistics and modeling, they are not usually considered in neuroscience. Thus, our initial work included a careful analysis of these assumptions, and the design of analytic procedures that would not violate these assumptions.

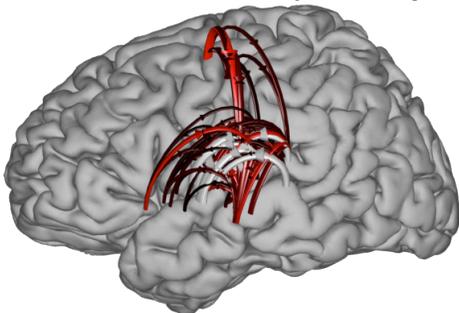
The next step was to establish procedures that can determine that subset of functional connectivity that is in fact related to the task. We began by designing procedures that would establish such task-related functional connectivity by evaluating functional connectivity in relatively short time windows (e.g., 1-sec) and then determining the statistical difference between functional connectivity metrics during the task and during rest, i.e., a within-subject analysis.



The figure on the previous page shows, for each of the seven subjects, those functional connections in ECoG gamma activity (shown in colored arrows) that were statistically different between the task and rest condition. They also highlight those cortical areas that were separately identified as being related to auditory, face motor, or hand motor function (green, red, or blue shading, respectively). Thus, this work produced the first comprehensive analysis of ECoG functional connectivity related to auditory processing. While the results are largely consistent with expectations given by current understanding in functional neuroanatomy, this was not always the case (e.g., the highly statistically significant (blue) connection from temporal to superior prefrontal cortex in the last subject). Careful analyses determined that the likely cause for such potentially incorrect result is the fundamental assumption made by almost all task-related analyses of brain signals that, with the exception of changes inducted by the particular task, the brain is in the same state during the task and during rest, which does not need to be the case.

Based on this consideration, we then evaluated a completely new technique to establish task-related brain signal activation and functional connectivity. This technique tests statistically whether a particular brain signal in one subject during task execution is similar to, or causally related to, a particular brain signal in a different subject. Thus, the only possibility for a brain signal in one subject to be similar to, or causally related to, a brain signal in a different subject is if they are both related to the task. This method had never before been applied to ECoG activity, and never before been applied to functional connectivity. The attached paper describes this method in detail, and applies it to determine task-related activation of ECoG activity. This paper is currently in submission with the Journal of Neuroscience, after favorable review of our presubmission inquiry.

Finally, we applied the same concept to Granger causality that is evaluated across subjects, i.e., asking the question whether one particular brain signal feature in one location in one subject is causally related to one particular brain signal feature in one location in a different subject. To date, this completely novel approach has produced extremely exciting results that we are currently working on summarizing in a journal paper. The figure below shows these results that were derived from all seven subjects. Each arrow indicates statistically significant causal relationship between two areas in the brain. The color/width of each arrow is proportional to the significance. All of these functional connections are in line with expectations based on current understanding of neurophysiology. However, this is the first time that such detailed and meaningful results have been derived directly and objectively directly from brain signals.



Section: Behavioral/Systems/Cognitive

Senior Editor: Dr. Sabine Kastner

Title: Common Inter-individual Physiology During Processing of Complex Sounds

Abbreviated Title: Common Inter-individual Physiology During Processing of Complex Sounds

Authors: Cristhian Potes^{1,2}, Peter Brunner^{1,3,4}, Aysegul Gunduz^{1,3,5}, Robert T. Knight⁶, Gerwin Schalk^{1,2,3,7,8,9}

¹ BCI R&D Program, Wadsworth Center, New York State Department of Health, Albany, NY, USA

² Department of Electrical and Computer Engineering, University of Texas at El Paso, TX, USA

³ Department of Neurology, Albany Medical College, Albany, NY, USA

⁴ Department of Computer Science, Graz University of Technology, Graz, Austria

⁵ Department of Biomedical Engineering, University of Florida, Gainesville, FL, USA

⁶ Department of Psychology, University of California at Berkeley, CA, USA

⁷ Department of Neurological Surgery, Washington University School of Medicine, St. Louis, MO, USA

⁸ Department of Biomedical Engineering, Rensselaer Polytechnic Institute, Troy, NY, USA

⁹ Department of Biomedical Science, State University of NY at Albany, Albany, NY, USA

Corresponding Author: Gerwin Schalk, Ph.D., Wadsworth Center, NYS Dept. of Health, Albany, NY 12201, USA. schalk@wadsworth.org

Numbers of figures: 4, **Number of pages:** 5, **Number of words:** 3565

Keywords: auditory processing, electrocorticography (ECoG), thalamo-cortical interactions, alpha and high gamma activity

Acknowledgements: This work was supported by grants from the US Army Research Office (W911NF-12-1-0109, W911NF-08-1-0216), the NIH/NIBIB (EB006356 and EB000856), and the NIH/NINDS (NS21135). We gratefully acknowledge Dr. Ritaccio for his help with patient interactions, the staff at Albany Medical College for assistance with the recordings, and the cooperation of the subjects in this study.

Conflict of Interest: The authors declare no competing financial interests.

Common Inter-individual Physiology During Processing of Complex Sounds

Cristhian Potes^{a,b}, Peter Brunner^{a,c,d}, Aysegul Gunduz^{a,c,e}, Robert T. Knight^f, Gerwin Schalk^{a,b,c,g,h,i,*}

^aBCI R&D Program, Wadsworth Center, New York State Department of Health, Albany, NY, USA

^bDepartment of Electrical and Computer Engineering, University of Texas at El Paso, TX, USA

^cDepartment of Neurology, Albany Medical College, Albany, NY, USA

^dDepartment of Computer Science, Graz University of Technology, Graz, Austria

^eDepartment of Biomedical Engineering, University of Florida, Gainesville, FL, USA

^fDepartment of Psychology, University of California at Berkeley, CA, USA

^gDepartment of Neurological Surgery, Washington University School of Medicine, St. Louis, MO, USA

^hDepartment of Biomedical Engineering, Rensselaer Polytechnic Institute, Troy, NY, USA

ⁱDepartment of Biomedical Science, State University of NY at Albany, Albany, NY, USA

Abstract

An enduring scientific and philosophical question has been to what extent the human brain functions similarly across individuals. Whether the electrical activity of neuronal populations at a particular brain location is similar across individuals performing the same task (e.g., listening to music), and how this activity is related to the underlying anatomy, are largely unknown. Here we demonstrate, using subdural cortical recordings in humans, that the instantaneous activity of both alpha (8-12 Hz) and high gamma (70-170 Hz) amplitudes was strongly correlated across individual subjects at neuroanatomical locations implicated in auditory processing. In particular, for ECoG amplitudes in the alpha band, we identified robust intersubject correlation (ISC) values only in areas adjacent to primary auditory cortex, which has been known to receive afferent auditory projections from the thalamus. In contrast, for ECoG power in the high gamma band, we identified robust ISC values not only in areas close to primary auditory cortex, but also in auditory association and premotor cortices, which have been shown to be involved in higher-order auditory processing. These results provide the first neurophysiological demonstration that neural activity associated with auditory processing is conserved across individuals and provide additional evidence for the distinct neurophysiological mechanisms of alpha and gamma activity.

Keywords: auditory processing, electrocorticography (ECoG), thalamo-cortical interactions, alpha and high gamma activity

1. Introduction

1 Korbinian Brodmann published a map of the hu-
2 man cortex in 1909 (Brodmann, 1909), which revealed

3 that the brain's anatomical organization and cytoarchi-
4 tecture share similarities across humans. Since then,
5 a large number of studies have associated particular
6 anatomical areas with particular functions. For in-
7 stance, neuroimaging studies have demonstrated that
8 brain metabolic activity detected over a period of sev-
9 eral seconds during the presentation of sounds (Hejnar
10 et al., 2007) and movies (Hasson et al., 2004) indexes
11 areas that are similar across subjects. Further, human
12 lesion studies have shown that damage to Brodmann
13 areas 41-42 or Brodmann area 17 leads to a loss of
14 auditory or visual function (Peretz et al., 1994; Moore
15 et al., 2001), respectively. However, it remains un-
16 known whether the temporal patterns of the neural ac-
17

*Corresponding author

Gerwin Schalk, Ph.D.
Wadsworth Center, NYS Dept. of Health
C650 Empire State Plaza
Albany, New York 12201, USA
schalk@wadsworth.org

Email addresses: cmpotes@gmail.com (Cristhian Potes),
pbrunner@wadsworth.org (Peter Brunner),
aysgunduz@gmail.com (Aysegul Gunduz),
rtknight@berkeley.edu (Robert T. Knight),
schalk@wadsworth.org (Gerwin Schalk)

18 tivity associated with auditory processing are similar
19 across humans, and how this activity may be related
20 to the underlying anatomy. We addressed these two
21 questions using cortical surface recordings in seven
22 human subjects.

23 2. Materials and Methods

24 2.1. Subjects and Data Collection

25 We recorded electrical activity from the surface
26 of the brain (electrocorticography (ECoG)) of seven
27 epileptic subjects (2 men, 5 women) who were listen-
28 ing to a complex natural auditory stimulus (the song
29 “Another Brick in the Wall - Part 1” (Pink Floyd,
30 Columbia Records, 1979)). These subjects underwent
31 temporary implantation of subdural electrode arrays to
32 localize eloquent cortex and the source of the epileptic
33 seizure prior to surgical resection. The implanted elec-
34 trode grids consisted of platinum-iridium electrodes
35 that were 4 mm in diameter (2.3 mm exposed) and
36 spaced with an inter-electrode distance of 0.6 or 1 cm.
37 The total numbers of implanted electrodes were 98,
38 96, 83, 109, 58, 120, and 58 for the different subjects,
39 respectively. Electrodes were implanted on the left
40 hemisphere for all subjects (see Fig. 1 for electrode
41 coverage). ECoG signals were digitized at 1200 Hz,
42 synchronized with stimulus presentation, and stored
43 using the BCI2000 software platform (Schalk et al.,
44 2004). ECoG signals were recorded while the subjects
45 were listening to the song, which was 3:10 min long,
46 digitized at 44.1 kHz in waveform audio file format,
47 and binaurally presented to each subject using in-ear
48 monitoring earphones. In addition, we recorded the
49 same amount of ECoG signals while subjects were at
50 rest with eyes open. We visually inspected the record-
51 ings and removed those electrodes that did not clearly
52 contain ECoG signals or had epileptic activity, which
53 left 93, 86, 82, 104, 56, 108, and 57 electrodes for the
54 different subjects. The ECoG signals from these elec-
55 trodes were submitted to the analyses described below.

56 2.2. Extraction of ECoG and Sound Features

57 To determine whether the brain’s instantaneous neu-
58 ral activity at a particular location is similar across in-
59 dividuals, we first extracted the time course of two
60 ECoG processes (i.e., amplitudes in the alpha (8-12
61 Hz) and high gamma (70-170 Hz) frequency bands).
62 Activity in the alpha band is thought to represent
63 thalamo-cortical interactions (Steriade et al., 1990;

64 da Silva, 1991; Zhang et al., 2004), whereas activ-
65 ity in the high gamma band is believed to index the
66 activity of local population of neurons (Miller et al.,
67 2009; Miller, 2010). To extract the time course of al-
68 pha and high gamma activity, we filtered ECoG sig-
69 nals from each electrode at each specific frequency
70 band using an IIR band-pass filter, and removed spatial
71 noise common to all ECoG electrodes using a com-
72 mon average reference (CAR) spatial filter. We then
73 computed the envelope of the ECoG signal (i.e., the
74 magnitude of the analytic signal) in each frequency
75 band, low-pass filtered the result at 5 Hz using an IIR
76 filter, down-sampled the result to 10 Hz, and removed
77 the linear trends from the resulting time series. To ex-
78 tract the song’s sound intensity, we computed the av-
79 erage power derived from non-overlapping 10 ms seg-
80 ments of the song. We then smoothed the sound in-
81 tensity by applying a low pass IIR filter at 0.5 Hz and
82 down-sampling the result to 10 Hz. All filtering oper-
83 ations were performed forwards and then backwards
84 (using Matlab’s `filtfilt` command) to avoid an in-
85 troduction of a group delay. The following analyses
86 then determined whether the time courses of ECoG
87 alpha and gamma amplitudes were similar across sub-
88 jects.

89 2.3. Intersubject Correlation Analysis (ISC)

90 We first defined the brain anatomy of each sub-
91 ject using pre-operative magnetic resonance imaging
92 (MRI) scans, and the location of the electrodes using
93 post-operative computer tomography (CT) imaging.
94 We then created a 3D surface model of each subject’s
95 cortex from the MRI images, co-registered it with the
96 location of the electrodes given by the CT images us-
97 ing Curry Software (Compumedics NeuroScan), and
98 transformed the 3D model and electrode locations into
99 Talairach space (see Fig. 1).

100 We then related ECoG activity across subjects. Be-
101 cause the location of the electrodes usually varies
102 across subjects, we identified, for each electrode loca-
103 tion in each subject, all electrodes from all other sub-
104 jects that were in close proximity (<1 cm) to that elec-
105 trode. (This way, brain activity from one individual
106 was exclusively compared to brain activity from other
107 subjects.) For each such pair of electrodes, we com-
108 puted the average Talairach coordinate, which resulted
109 in a total of 6852 locations (314 ± 117 per subject com-
110 bination) that formed the basis for our analyses. For
111 each of these locations/electrode pairs, and separately

112 for ECoG activity in the alpha and high gamma band, 160
113 we computed the pairwise Spearman correlation coefficient 161
114 (intersubject correlation (ISC) r) and its significance 162
115 (i.e., p -value). We repeated the same procedure 163
116 for all locations and all 21 combinations of 164
117 subjects. Next, we determined all locations whose p - 165
118 values were significantly different than chance at the 166
119 0.001 level (i.e., $p < 0.001$ after Bonferroni correction 167
120 for 6852 locations), and projected the negative loga-
121 rithm of the corresponding p -values ($-\log_{10}(p)$) on to
122 the 3D brain cortical template provided by the Mon-
123 treal Neurological Institute (MNI).

124 In addition, we calculated Granger causality 170
125 (Granger, 1969) to test the hypothesis whether alpha 171
126 activity statistically causes high gamma activity 172
127 or vice versa. In this analysis, we used a model order 173
128 of 10, which was suggested by the Bayesian in- 174
129 formation criterion (BIC) (Schwarz, 1978). Finally, 175
130 we determined the lag between activity in these two 176
131 time courses by identifying the time of the peak of the 177
132 cross-correlation function. 178

133 3. Results

134 3.1. Relevant Cortical Locations

135 The black dots and colored areas in Fig. 2a give 183
136 the locations and corresponding $-\log_{10}(p)$ values ac- 184
137 cumulated across all subjects, and highlight areas 185
138 wherein neural activity at these two frequency bands 186
139 was similar across individuals during the task (i.e., lis- 187
140 tening to music, left panels) as opposed to the con- 188
141 trol condition of rest (i.e., relaxing on a bed with eyes 189
142 open, right panels). There were a total of 277 signifi- 190
143 cant locations across all subjects, the two frequency 191
144 bands, and the task and control conditions. Specifi- 192
145 cally, for the ECoG recordings during the task condi- 193
146 tion, 29 locations had significant alpha-ISC values 194
147 (mean correlation \pm standard deviation across the 29
148 locations: $r = 0.14 \pm 0.01$, max $r = 0.18$) and were
149 primarily located in areas close to primary auditory
150 cortex (Fig. 2a, top-left). Moreover, 246 locations had
151 significant gamma-ISC values ($r = 0.19 \pm 0.05$, max
152 $r = 0.33$) and were not only located in areas close to
153 primary auditory cortex but also over auditory associa-
154 tion and premotor areas (Fig. 2a, bottom-left). In
155 contrast, for the ECoG recordings during rest, only 2
156 (Fig. 2a, top-right) and 0 (Fig. 2a, bottom-right) loca-
157 tions had significant alpha-ISC and gamma-ISC val-
158 ues, respectively. The number of locations with sig-
159 nificant alpha- and gamma-ISC values during the task

was larger than those during rest (Fisher’s exact prob-
ability test, two-tail, $p=4.51e-7$ for alpha, $p=1.88e-75$
for gamma). These results are summarized in Fig. 2b.
While ECoG activity during the task was correlated
across subjects in the alpha and high gamma band, this
was not the case for beta (12-30 Hz, 0 locations), low
gamma (40-65 Hz, 1 location), and very high gamma
(250-350 Hz, 0 locations) frequency bands.

168 3.2. Temporal Relationship

169 We then investigated the temporal relationship be- 170
171 tween alpha and high gamma activity, as well as the 171
172 song’s sound intensity. For this, we first averaged 172
173 the time courses of alpha and high gamma activity 173
174 across all locations where activity was significantly 174
175 correlated across individuals. Then, we correlated the 175
176 three averaged time courses of alpha activity, high 176
177 gamma activity, and the song’s sound intensity with 177
178 each other. The results are shown in Fig. 3 and reveal 178
179 a significant negative correlation between alpha and 179
180 high gamma activity ($r = -0.47$), indicating that high 180
181 gamma activity augmentation in auditory cortical ar- 181
182 eas during auditory processing is accompanied by al- 182
183 pha activity suppression (see also (Crone et al., 2001)). 183
184 We also found significant positive correlation between 184
185 high gamma activity and sound intensity ($r=0.28$), in 185
186 line with our previous findings (Potes et al., 2012), as 186
187 well as significant negative correlation between alpha 187
188 activity and sound intensity ($r = -0.21$). ($p < 0.0001$, 188
189 Spearman’s correlation, $n=1800$). The scatter plots 189
190 shown in Fig. 3b further illustrate these relationships. 190
191 Importantly, Granger analysis assessing information 191
192 flow revealed that high gamma activity predicted alpha 192
193 activity ($p \ll 1e^{-8}$), but not vice versa, and cross- 193
194 correlation analysis indicated that the onset of high 194
195 gamma activity preceded alpha activity by 280 ms.

195 3.3. Spatial Relationship

196 To answer the second question of this study, we in- 196
197 vestigated the spatial relationship of these two ECoG 197
198 processes (i.e., alpha and high gamma activity) with 198
199 the underlying auditory anatomy. To do this, we re- 199
200 lated those cortical areas with significant alpha- and 200
201 gamma-ISC values to the cortical and subcortical ar- 201
202 eas that are known to be involved in auditory process- 202
203 ing. Specifically, previous neurophysiological studies 203
204 have shown that neurons in the medial geniculate nu- 204
205 cleus of the thalamus send auditory information to the 205
206 cortex through projections that terminate in primary

207 auditory cortex (Steriade et al., 1990). In addition, 254
208 neurons in auditory cortex have projections back to the 255
209 thalamus. Theoretical considerations suggested that 256
210 thalamo-cortical projections (Fig. 4a) contribute to os- 257
211 cillations at low frequencies (6-12 Hz) (Linás et al., 258
212 1999), and recent experimental evidence in animals 259
213 is beginning to confirm the important role of thala- 260
214 mic modulation of cortical activity (Saalman et al., 261
215 2012). Our results identified significant alpha-ISC val- 262
216 ues close to primary auditory cortex, and thereby links 263
217 anatomical structures related to auditory processing 264
218 to oscillatory electrophysiological activity and its hy- 265
219 pothesized origin (Fig. 4b, c). Together with the find- 266
220 ings that high gamma and alpha activity are negatively 267
221 correlated, and that high gamma activity predicts al- 268
222 pha activity, our results are consistent with the hypoth- 269
223 esis that activity in the alpha band reflects interactions 270
224 between the thalamus and the cortex (Zatorre et al., 271
225 2007; Hackett, 2008; Saalman et al., 2012), and that 272
226 these interactions are driven by activity of local popu- 273
227 lations of neurons in the cortex. 274

228 4. Discussion

229 This study shows for the first time that the time- 279
230 course of neural activity recorded during listening to 280
231 music is conserved across individuals in cortical ar- 281
232 eas that are implicated in auditory processing — not 282
233 only in areas that process low-level aspects of audi- 283
234 tory stimuli (i.e., areas close to primary auditory cor- 284
235 tex) but also in areas that process higher-level aspects 285
236 of auditory stimuli (i.e., auditory associate and premo- 286
237 tor areas). 287

238 The results shown here also provide exciting new 288
239 hints about fundamental mechanisms of auditory pro- 289
240 cessing. Previous studies have provided increasing ev- 290
241 idence that oscillations in the alpha band modulate 291
242 cortical excitability (Saalman et al., 2012). Other 292
243 studies suggested that activity in the high gamma band 293
244 reflects the firing rate of the cortical neuronal popula- 294
245 tion beneath each electrode (Miller et al., 2009; Miller, 295
246 2010). Based on these existing hypotheses about the
247 mechanism of these distinct neurophysiological pro-
248 cesses, one may expect to find task-related activity in
249 the alpha band only close to auditory cortex, and task-
250 related activity in the high gamma band in all cortical
251 areas related to auditory processing. Our results pro-
252 vide the first direct electrophysiological confirmation
253 of this expectation. Specifically, the locations of sig-

nificant alpha-ISC values highlight early auditory cor-
tical cortex (Fig. 4c), whereas the locations of signif-
icant gamma-ISC values highlight cortical areas that
have been proposed to be activated in established cor-
tical auditory models (Kaas and Hackett, 1999; Za-
torre and Belin, 2001; Griffiths and Warren, 2002; Za-
torre et al., 2002, 2007; Hackett, 2008).

Taken together, our results suggest that thalamo-
cortical projections transmit auditory information
from the thalamus to early auditory cortex, from where
cortico-cortical projections relay the results to other
(predominantly peri-sylvian) areas that process more
complex auditory features (Zhang et al., 2004; Kumar
et al., 2007; Zatorre et al., 2007) (see illustrative yel-
low arrows in Fig. 4c). Our results also suggest that
stimulus-dependent activity in early auditory areas re-
sults in delayed feedback to the thalamus. In this view,
the thalamus regulates the flow of auditory informa-
tion into the cortex based on this feedback, such that
increases in auditory stimulus intensity result in sup-
pression of alpha activity, which in turn causes an en-
hancement of cortical excitability.

These results have several important implications.
First, our approach provides a novel method to de-
lineate task-related brain activity, which is currently
evaluated mostly by comparing brain activity during
a task to brain activity during rest within the same
subject. Second, the approach implemented here pro-
vides the basis for functional rather than anatomical
co-registration of brains of different individuals of the
same or even different species (Mantini et al., 2012).
Third, the finding that higher stimulus intensity leads
to an increase in cortical excitability, and thus to a pre-
sumed increase in the consequences of the stimulus,
may suggest a general mechanism to prioritize differ-
ent competing sensory streams, and could thus be use-
ful in explaining different types of stimulus-driven or
internally-generated (covert or overt) forms of atten-
tion. Finally, the concept that our brains speak a com-
mon “language” when they are coupled to the external
world suggests that we not only share similarities in
our bodies, but also in our minds. (Hasson, 2010).

References

- Brodmann K 1909 *Vergleichende Lokalisationslehre der Grosshirn-
rinde in ihren Prinzipien dargestellt auf Grund des Zellenbaues*
Johann Ambrosius Barth Verlag.
Crone N E, Boatman D, Gordon B and Hao L 2001 'Induced electro-
corticographic gamma activity during auditory perception' *Clin
Neurophysiol* **112**(4), 565–82.

- da Silva F L 1991 'Neural mechanisms underlying brain waves: from neural membranes to networks' *Electroencephalography and Neurophysiology* **79**, 81–93.
- Granger C W J 1969 'Investigating causal relations by econometric models and cross-spectral methods' *Econometrica* **37**(3), 424–38.
- Griffiths T D and Warren J D 2002 'The planum temporale as a computational hub' *Trends Neurosci* **25**(7), 348–53.
- Hackett T A 2008 'Anatomical organization of the auditory cortex' *J Am Acad Audiol* **19**, 774–779.
- Hasson U 2010 'I can make your brain look like mine.' <http://www.hbr.org>.
- Hasson U, Nir Y, Levy I, Fuhrmann G and Malach R 2004 'Inter-subject synchronization of cortical activity during natural vision' *Science* **303**, 1634–1640.
- Hejnar M P, Kiehl K A and Calhoun V D 2007 'Interparticipant correlations: A model free fMRI analysis technique' *Hum. Brain Mapp* **28**, 860–867.
- Kaas J H and Hackett T A 1999 "'What" and "Where" processing in auditory cortex' *Nat Neurosci* **2**(12), 1045–7.
- Kumar S, Stephan K E, Warren J D, Friston K J and Griffiths T D 2007 'Hierarchical processing of auditory objects in humans' *PLoS Comput Biol* **3**(6), e100.
- Llinás R R, Ribary U, Jeanmonod D, Kronberg E and Mitra P P 1999 'Thalamocortical dysrhythmia: A neurological and neuropsychiatric syndrome characterized by magnetoencephalography' *Proc Natl Acad Sci USA* **96**(26), 15222–27.
- Mantini D, Hasson U, Betti V, Perrucci M G, Romani G L, Corbetta M, Orban G A and Vanduffel W 2012 'Interspecies activity correlations reveal functional correspondence between monkey and human brain areas' *Nature Methods* **9**(3), 277–82.
- Miller K J 2010 'Broadband spectral change: evidence for a macroscale correlate of population firing rate?' *J Neurosci* **30**(19), 6477–9.
- Miller K J, Sorensen L B, Ojemann J G and den Nijs M 2009 'Power-law scaling in the brain surface electric potential' *PLoS Comput Biol* **5**, 1–10.
- Moore D R, Rothholtz V and King A J 2001 'Hearing: Cortical activation does matter' *Current Biology* **11**(19), R782 – R784.
- Peretz I, Kolinsky R, Tramo M, Labrecque R, Hublet C, Demeurisse G and Belleville S 1994 'Functional dissociations following bilateral lesions of auditory cortex' *Brain* **117**, 1283–1301.
- Potes C, Gunduz A, Brunner P and Schalk G 2012 'Dynamics of electrocorticographic (ECoG) activity in human temporal and frontal cortical areas during music listening' *Neuroimage* **61**(4), 841–48.
- Saalmann Y B, Pinsk M A, Wang L, Li X and Kastner S 2012 'The pulvinar regulates information transmission between cortical areas based on attention demands' *Science* **337**(6095), 753–756.
- Schalk G, McFarland D J, Hinterberger T, Birbaumer N and Wolpaw J R 2004 'BCI2000: a general-purpose brain-computer interface (BCI) system' *IEEE Trans Biomed Eng* **51**(6), 1034–1043.
- Schwarz G 1978 'Estimating the dimension of a model' *The annals of statistics* **6**(2), 461–464.
- Steriade M, Gloor P, Llinás R, da Silva F L and Mesulam M 1990 'Basic mechanisms of cerebral rhythmic activities' *Electroencephalography and Neurophysiology* **76**, 481–508.
- Zatorre R J and Belin P 2001 'Spectral and temporal processing in human auditory cortex' *Cereb Cortex* **11**(10), 946–53.
- Zatorre R J, Belin P and Penhune V B 2002 'Structure and function of auditory cortex: music and speech' *Trends Cogn Sci* **6**(1), 37–46.
- Zatorre R J, Chen J L and Penhune V B 2007 'When the brain plays music: auditory–motor interactions in music perception and production' *Nat Rev Neurosci* **8**, 547–558.
- Zhang Z, Chan Y S and He J 2004 'Thalamocortical and corticothalamic interaction in the auditory system' *Neuroembryology and Aging* **5**(239–48).

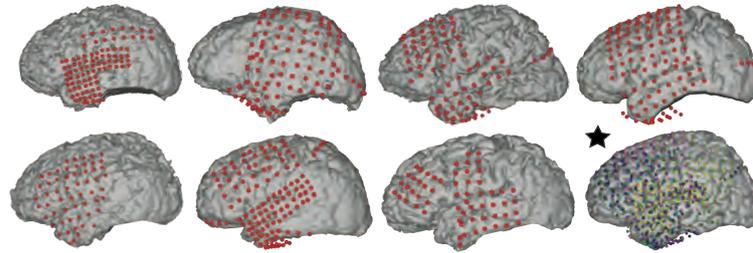


Figure 1: Subject-specific brain models and locations of implanted electrodes. The brain model template marked with a star shows the approximate location of implanted electrodes from all subjects.

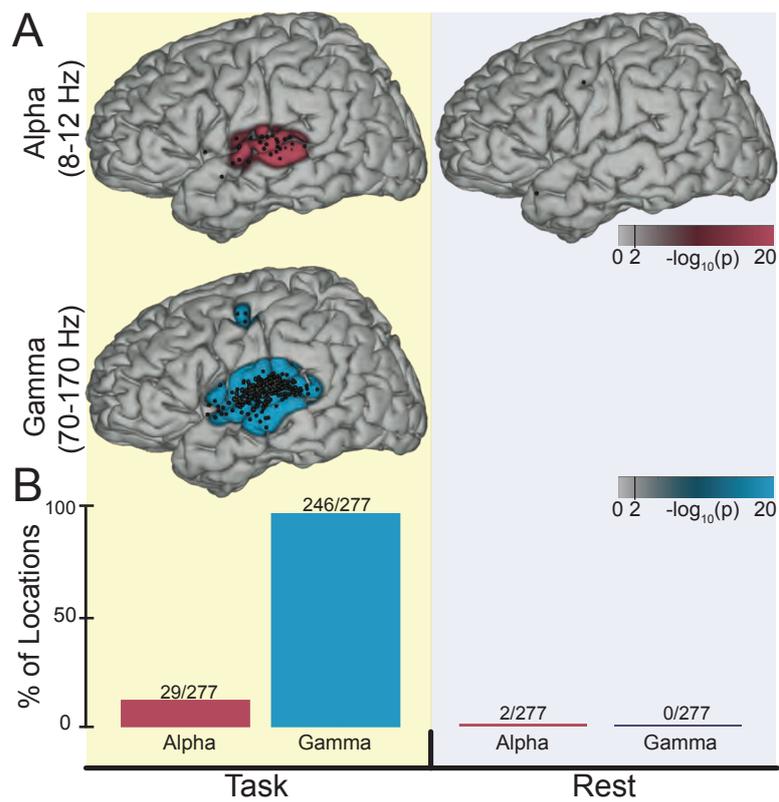


Figure 2: Intersubject correlation analysis. (A) Topographical distribution of accumulated negative log of the significance of the ISC values during the task (left panels) and rest (right panels) conditions for ECoG activity in the alpha (top row) and high gamma (bottom row) bands. Values larger than 2 are statistically significant at a confidence level of 99% (see vertical line in color bars). (B) Number of locations with significant ISC values at each frequency band and for task (left) and rest (right) and the total number of significant locations (277).

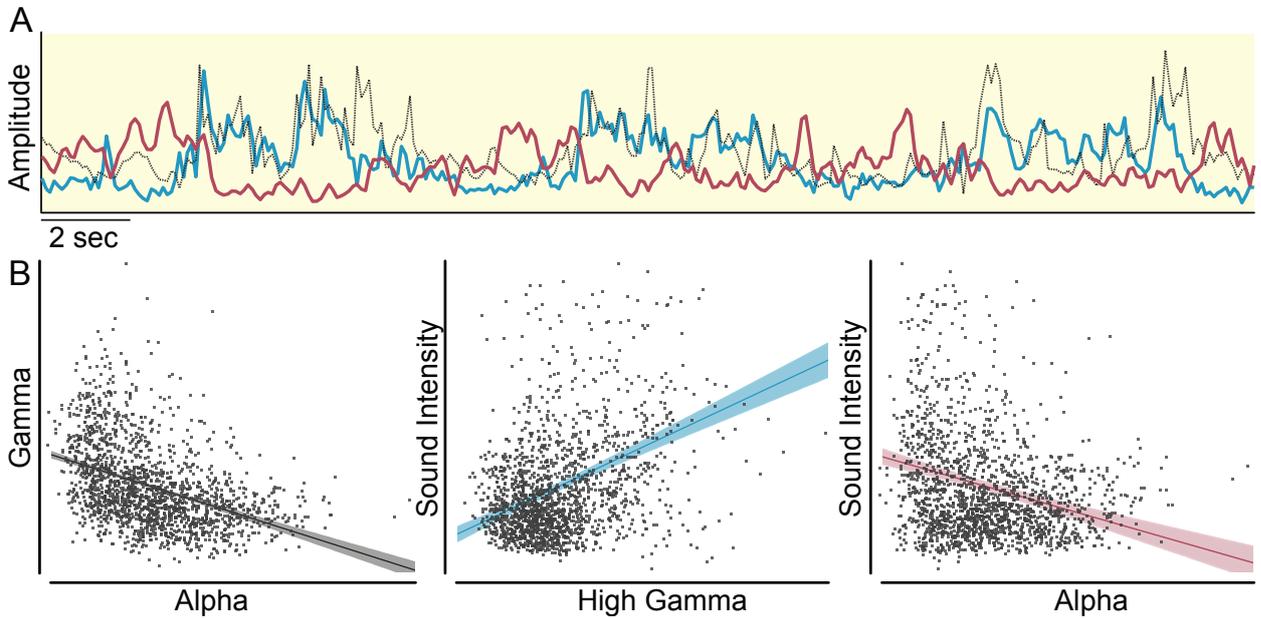


Figure 3: Temporal relationship between alpha, high gamma, and sound intensity. (A) Representative part of the time course of the sound intensity (black trace) and the average time course of ECoG gamma (blue trace) and alpha (red trace) activity. (B) Scatter plots illustrate the relationship between these three variables for all data points, as well as regression lines and their 95% confidence bands.

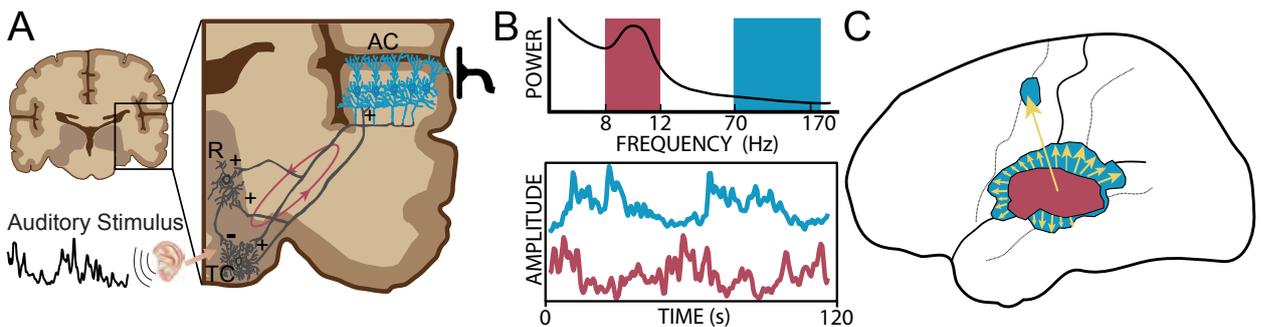


Figure 4: Relationship between anatomy of auditory processing, current understanding of ECoG physiology, and our results. (A) Auditory pathways between the medial geniculate nucleus of the thalamus and primary auditory cortex. Thalamic neurons (i.e., thalamo-cortical (TC) and reticular (R) neurons) are shown in gray, auditory cortex (AC) neurons are shown in blue, and their interactions are shown in red. (B) Top: Exemplary illustration of typical power spectral density of ECoG signals. Activity in the alpha (8-12 Hz) band, indicated by the red band, reflects thalamocortical interactions. Activity in the gamma (70-170 Hz) band, indicated by the blue band, indexes activity of local populations of neurons. Bottom: Average time course of the first 120 sec of ECoG activity. The blue trace gives gamma activity — the red trace gives alpha activity. (C) Outline of areas with significant ISC values in the alpha and gamma ECoG amplitudes given by the results in Fig. 1. Taken together, our results are consistent with the hypothesis that auditory information reaches the cortex in areas close to auditory cortex, from where they are communicated to peri-sylvian and distinct frontal cortical locations (see illustrative yellow arrows).