

Connecting musicality with other traits

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<https://www.vumc.org/music-cognition-lab/>

@CrunchyNeuroSci

June 19, 2019

**KNAW Master Class on Musicality and Genomics
Amsterdam**

It all started with rhythm and grammar...

Developmental Science

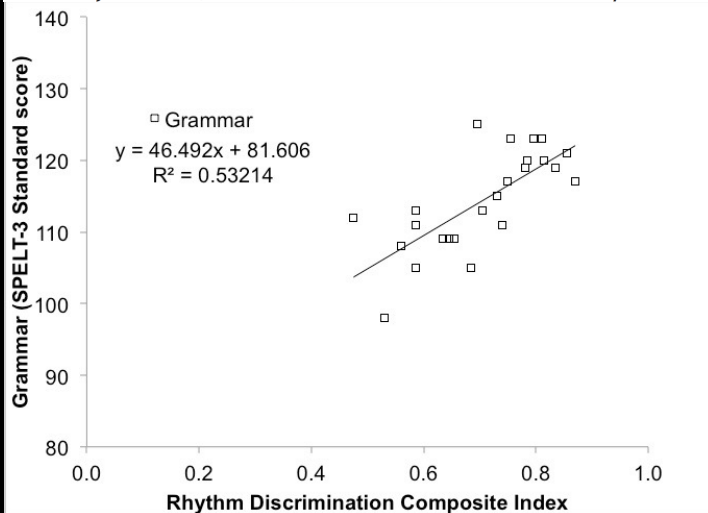
Developmental Science 18:4 (2015), pp 635-644

DOI: 10.1111/desc.12230

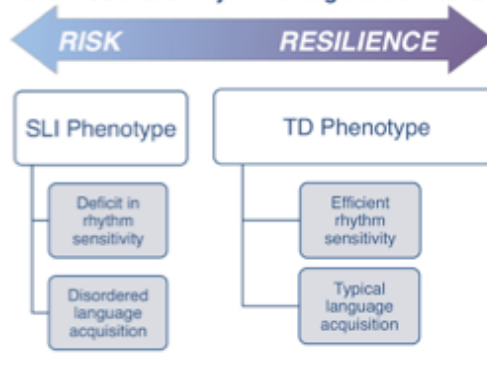
SHORT REPORT

Musical rhythm discrimination explains individual differences in grammar skills in children

Reyna L. Gordon,¹ Carolyn M. Shivers,¹ Elizabeth A. Wieland,² Sonja A. Kotz,^{3,4} Paul J. Yoder¹ and J. Devin McAuley⁵



Proposed framework for shared genetic architecture of rhythm and grammar traits



DEVELOPMENTAL LANGUAGE DISORDER

Developmental Language Disorder (DLD) is an invisible, under-diagnosed condition that affects over 7% of children.



That's two kids in every classroom

between **5-7 million children** in the US are affected



Treatment Efficacy & Language Learning Lab

Vanderbilt
Genetics Institute



Individual differences in language and music abilities

- Emerging evidence for plasticity effects of music training
- But... associations between language and music are present in young children before formal music training
- shared neural resources for language and music

“Influence” of music training

Psychophysiology, 41 (2004), 341–349. Blackwell Publishing Inc. Printed in the USA.
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DOI: 10.1111/1469-8986.00172.x

The music of speech: Music training facilitates pitch processing in both music and language

Musician Children Detect Pitch Violations in Both Music and Language Better than Nonmusician Children: Behavioral and Electrophysiological Approaches

Cyrille Magne^{1,2}, Daniele Schön^{1,2}, and Mireille Besson^{1,2}

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Abstract

■ The idea that extensive musical training can influence processing in cognitive domains other than music has received considerable attention from the educational system

and the media. Moreover, the greatest differences in the ERPs of musician and nonmusician children were also found for the early mismatch negativity (MMN) component, which is thought to be related to early neuroplasticity: whereas for musician children, early neuroplasticity developed in music and late positive com-

From Notes to Vowels: Neural Correlations between Musical Training and Speech Processing

Iliza M. Butera

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Review of Bidelman and Alain

Decades in Categorical Vowel Perception

Gavin M. Bidelman^{1,2} and Claude Alain^{3,4,5}

Decades in Categorical Vowel Perception
Interact Neuroplasticity
Interact Age-Related

Music and language expertise: what drives the underlying biology?

ANNALS OF THE NEW YORK ACADEMY OF SCIENCES

Issue: *The Neurosciences and Music V*

Music training and speech perception: a gene–environment interaction

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Inherent auditory skills rather than formal music training shape the neural encoding of speech

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Edited by Dale Purves, Duke University, Durham, NC, and approved November 6, 2018 (received for review July 9, 2018)

Musical training is associated with a myriad of neuroplastic changes in the brain, including more robust and efficient neural processing of event-related potentials (ERPs) and fMRI show differential speech activity in musicians at cortical levels of the nervous system

- Shared neural resources for language and music may be partially genetic, rather than expertise transfer effects

...jumping into the deep end...

- Genotype children in participating in our rhythm & grammar study?
 - Initial plan: single SNP on *ANKK1* involved in grammar and timing? (Wong et al, 2013; Wiener et al, 2014)
 - Instead: we needed to look more broadly across the genome!
 - Larger goals:
 - Is human communication built in part on biological architecture for rhythm? (Fitch, 2017).
 - How is the genetic basis of rhythm related to health and disease?



Nancy Cox, PhD



Reyna learning genetics...



... but then we needed...

- *...large sample sizes to conduct Genome-Wide Association Studies (GWAS) on rhythm & grammar*
- Leverage big data: combine other findings from the literature with new data/new analyses from large-scale biobanks?
- Musical GWAS groundwork in large samples are needed (see review by Gingras, Honing, Peretz, Trainor & Fisher, 2015)



Lessons learned

- Look to twin studies to see if your trait is heritable
- Be skeptical of candidate gene studies for which the candidate genes did not originally come from a well-powered GWAS



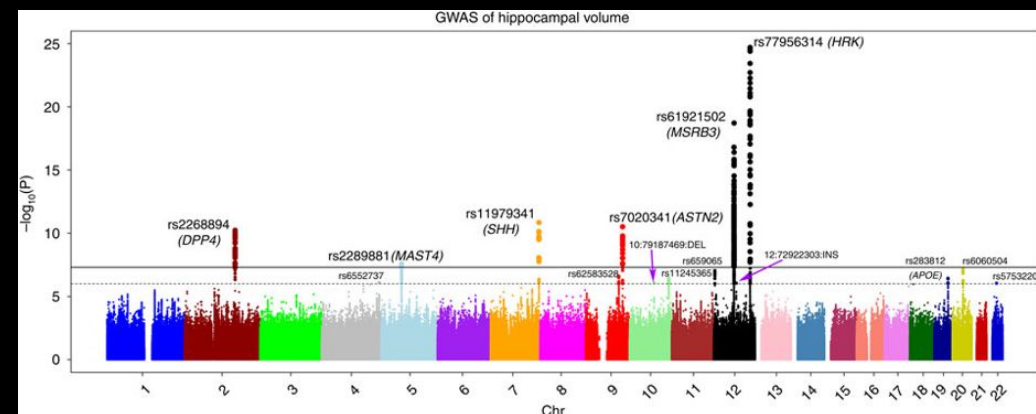
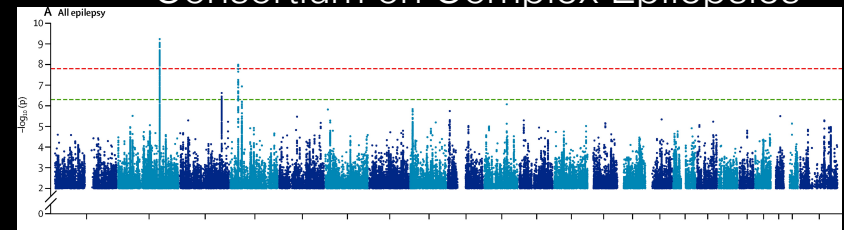
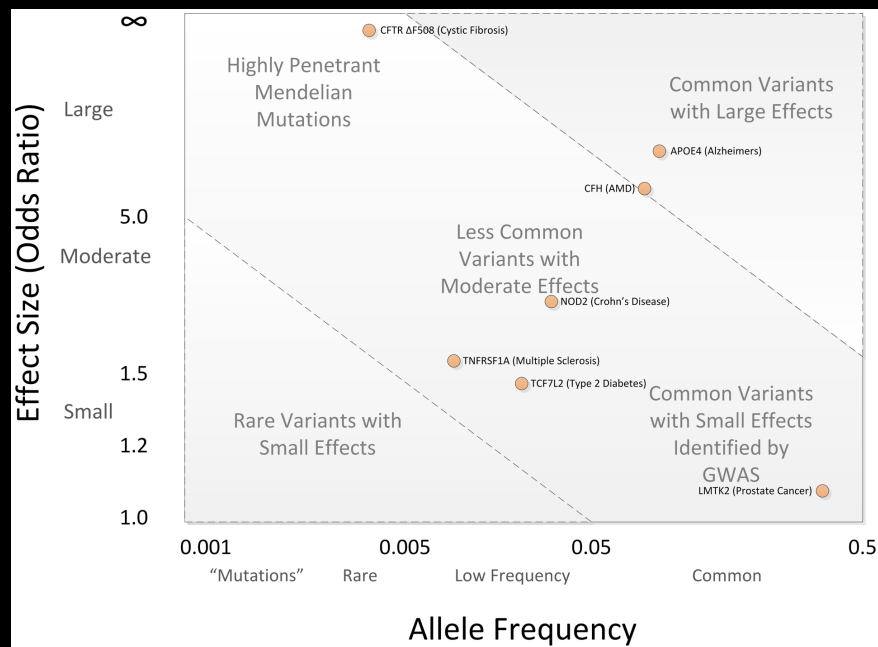
Genetics of rhythm

- Twin studies: Musical rhythm ability is moderately heritable (Ullén et al, 2014) , and correlates with IQ (Ullén et al., 2014; Mosing et al., 2016)
 - Who pursues music training? Music training and musical practice are heritable, too! (Mosing et al, 2014; Butkovic et al, 2015)
- suggestive molecular genetic evidence calls for large GWAS sample (Oikkonen et al., 2015; Wiener et al., 2011; 2014)
- Goals of current study:
 - Large-scale genome-wide interrogation on self-reported rhythm phenotype (“*Can you clap in time with a musical Beat?*”), collaboration with 23andMe
 - Does rhythm share genetic architecture with other traits?

Genome-Wide Association Study

GWAS allows us to compare associations of genetic markers with phenotypic traits (e.g., rhythm scores, or disease vs healthy control...) from strategically measured “markers” (SNPs) across the genome

International League Against Epilepsy Consortium on Complex Epilepsies



Hibar et al, 2017

An Introduction to Genome-Wide Association Studies: GWAS for Dummies *good starting place for learning about GWAS*

A. G. Uitterlinden, PhD¹

PROGRAM FOR
MUSIC, MIND & SOCIETY
at VANDERBILT

GWAS study design

Question: *Can you clap in time with a musical beat?*

Yes N=555,660

No N= 51,165

Total: N=606,825

23andMe research participants of European ancestry



Maria Niarchou

Niarchou, Sathirapongsasuti, Jacoby, 23andMe research team, McAuley, Bell, Mosing, MacArthur, Straub, Creanza, Ullén, Capra, Hinds, Davis, & Gordon, *in preparation*



Lea Davis

Phenotype validation study

Internet-based - Amazon Mechanical Turk
(separate sample)
N=724 (mean age =36 years, F=333)

Self-report:

Can you clap in time with a musical beat? (Yes, No, I'm not sure)

Rhythm discrimination test:

Rhythm perception test based on Grahn & Brett (2007).

8 practice + 32 unique trials

“Yes” responders => better rhythm perception
 $t(677)=3.148$ $p=0.002$, Cohen's $d=0.64$

Instructions:

Previous Next...

If you hear... ...you respond

First rhythm Second rhythm Third rhythm
Same as first and second

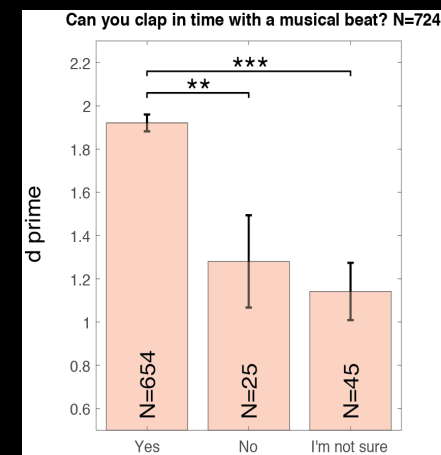
...you respond

First rhythm Second rhythm Third rhythm
Different from first and second

...you respond

DIFFERENT

In this experiment, you will be listening to rhythms. On each trial of the experiment, you will hear a series of three rhythms. The first two rhythms will always be the same. The third (last) rhythm in the series will either be the same rhythm or will be different from the first two in the series. Your task is simply to judge whether the last rhythm in the series is the SAME rhythm or is DIFFERENT from the first two in the series. All of your responses will be made using the response box in front of you. Press the button labeled SAME if you think that all three rhythms are the same. Press the button labeled DIFFERENT if you think the last rhythm in the series is DIFFERENT from the other two. Please be sure to listen to all three rhythms before responding.



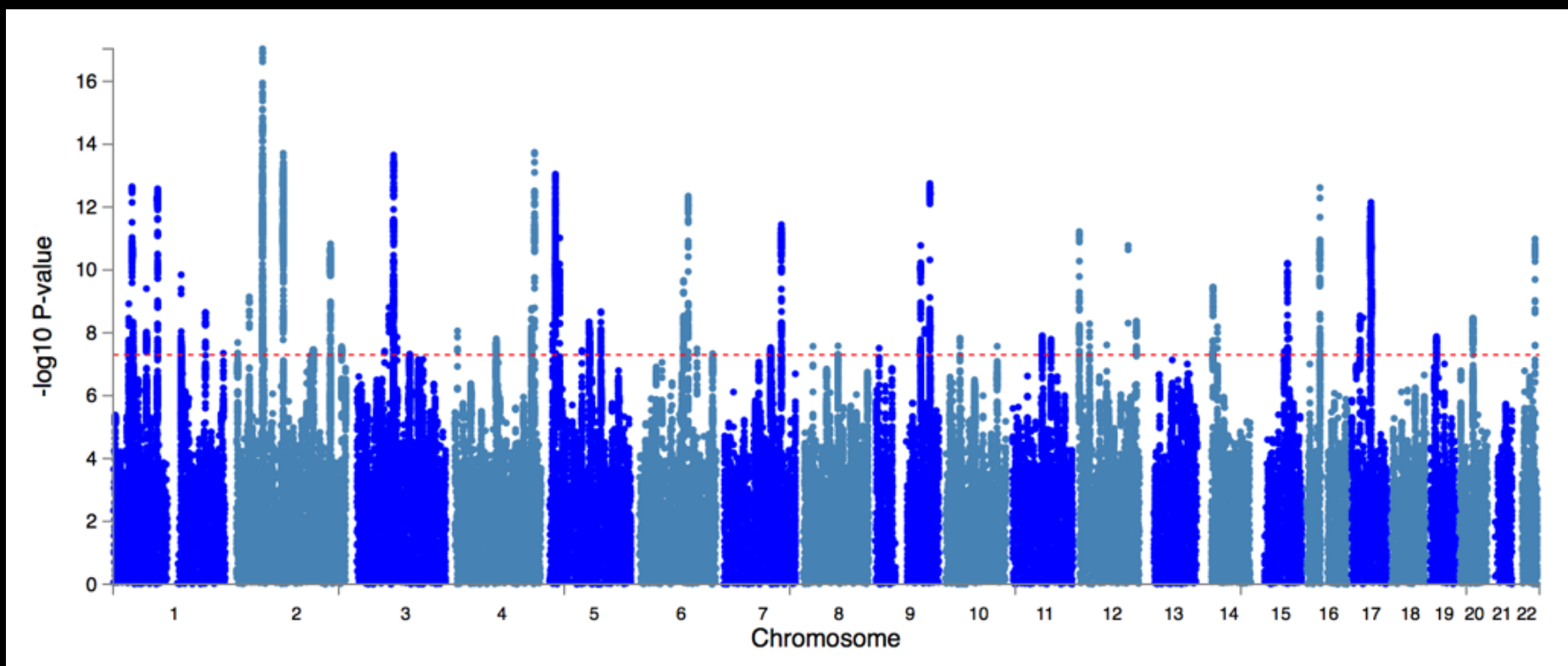
Nori Jacoby + Eammon Bell

GWAS results: do common genetic variants account for variability in our rhythm trait?

Yes!

68 independent loci - genome-wide significance ($p < 5 \times 10^{-8}$).

Observed SNP-heritability = 5% computed w/ LD-score regression

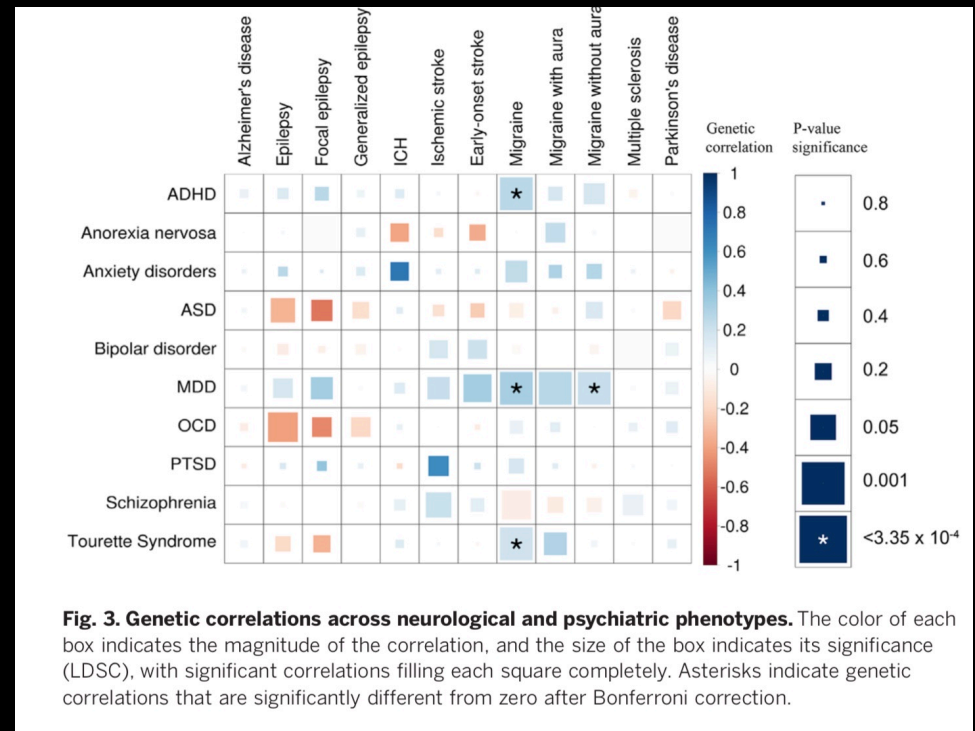




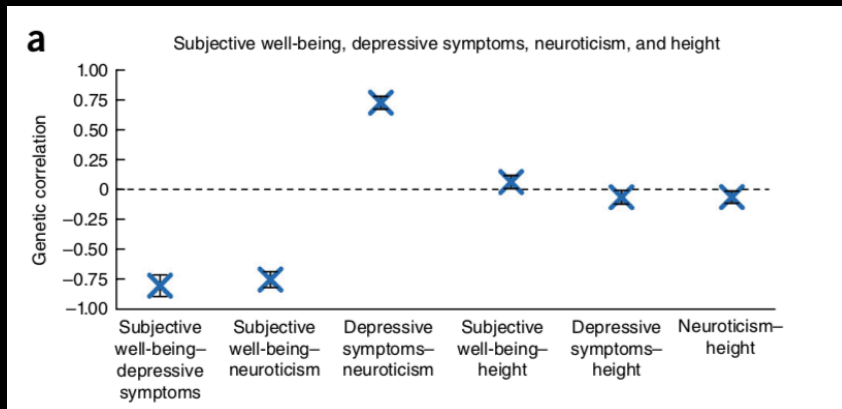
Does our rhythm phenotype share genetic architecture with other traits?

- exploratory investigation of other traits in LDHub (genetic correlations)
- control for known GWAS markers of IQ/EA (conditional analyses)

Utilizing genetic correlations



Anttila, Brainstorm Consortium et al, 2018



Okbay et al., 2016, Nature Genetics

Exploration of Genetic Correlations

- **Genetic Correlations tested against all traits in LD Hub**

- Rhythm is associated with:

- *faster processing speed*

neural efficiency/cognition

- *hand grip strength*

motor function

- *chronotype (being an evening person)*

musician/musical environment?

- *tinnitus*



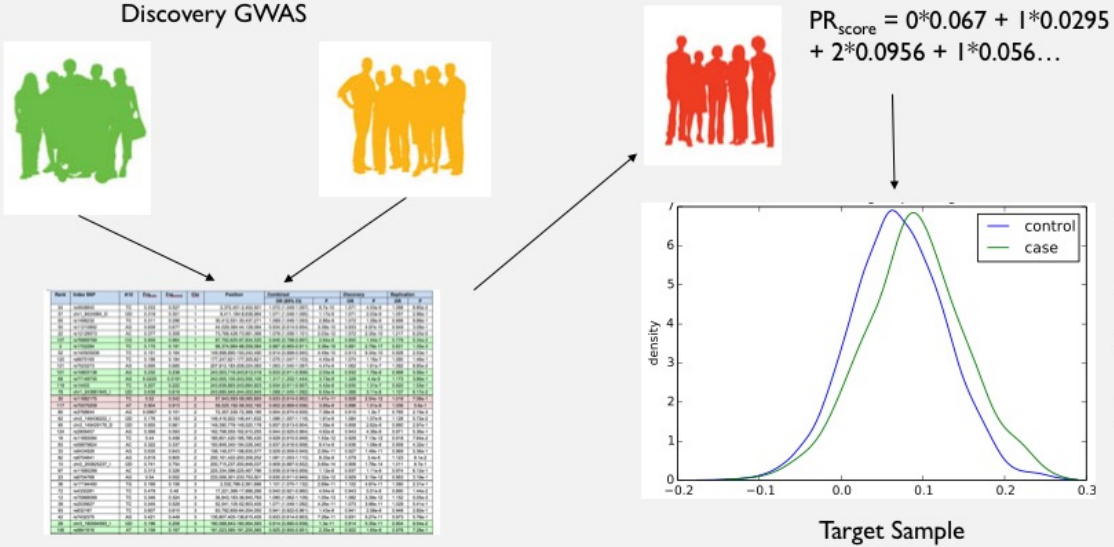
Lessons learned

- Many interesting analyses are possible from group-level summary statistics
 - check out FUMA <http://fuma.ctglab.nl> and LDHub <http://ldsc.broadinstitute.org/ldhub/>
- You can look at genetic correlations between traits from *separate samples!*



Health & BioVU

POLYGENIC SCORE ANALYSIS



STRUCTURE OF THE VANDERBILT EHR AND BIOBANK

The Synthetic Derivative
A de-identified and continuously-updated image of the EMR (>2.9 M individuals)

BioVU

- DNA samples available: >270,000
- Plasma collection underway

Redeposited genotypes

- Subjects with GWAS data: >109,000
- Subjects with any genotyping: >120,000

- Median length of EHR is ~1 year, max is 20 years
- Tertiary care center: ascertainment for sicker people
- Music City: ascertainment for musicians
- Median length of EHR for genotyped BioVU subjects is ~10 years
- Average age of BioVU is 58





What can genomic analyses tell us about the basis for this trait?

- Large-scale GWAS yielded 68 genomic loci associated with self-reported rhythm ability
 - many loci previously linked to behavioral, cognitive, and neurological traits + 23 novel loci
- enrichment of rhythm heritability in gene expression in brain tissue
 - *consistent with auditory-motor networks underlying rhythm*
- Genetic correlations and polygenic risk score analyses generate hypotheses for future genetic (and epidemiological!) work on *rhythm + cognition, motor abilities, sleep, & mental health*



Genetics of DLD

Specific language impairment

- (Selective) deficit in communication/language skills where nonverbal ability is normal; Grammar and vocabulary are particularly affected.

- also known as **developmental language disorder**

- long-term academic, economic, and social consequences - late talking that never catches up, also struggle with reading

- example: “our cat looks very smaller”

- **Children with SLI struggle with complex sentences**

sentence repetition task:

[prompt]: *That’s the ladybug that Christina saw on the grass*

child: “The ladybug sink into the grass.”

DEVELOPMENTAL LANGUAGE DISORDER

Developmental Language Disorder (DLD) is an invisible, under-diagnosed condition that affects over 7% of children.



2 in 30 children have DLD



That's two kids in every classroom

between **5-7 million children** in the US are affected



~~Specific~~ Language Impairment

- Their deficits are not restricted to language! They also struggle with:
 - the nuances of speech rhythm
 - singing
 - recognizing melodies
 - tapping to the beat and perceiving differences in musical rhythms

Automated Phenotyping Tool for identifying **DLD** cases in health-systems data (**APT-DLD** phenotyping algorithm)

Goal: *Large-scale cohort identification of developmental language disorder in existing Electronic Health Record Databases*



Rachana Nitin

Step I: Broad search criteria

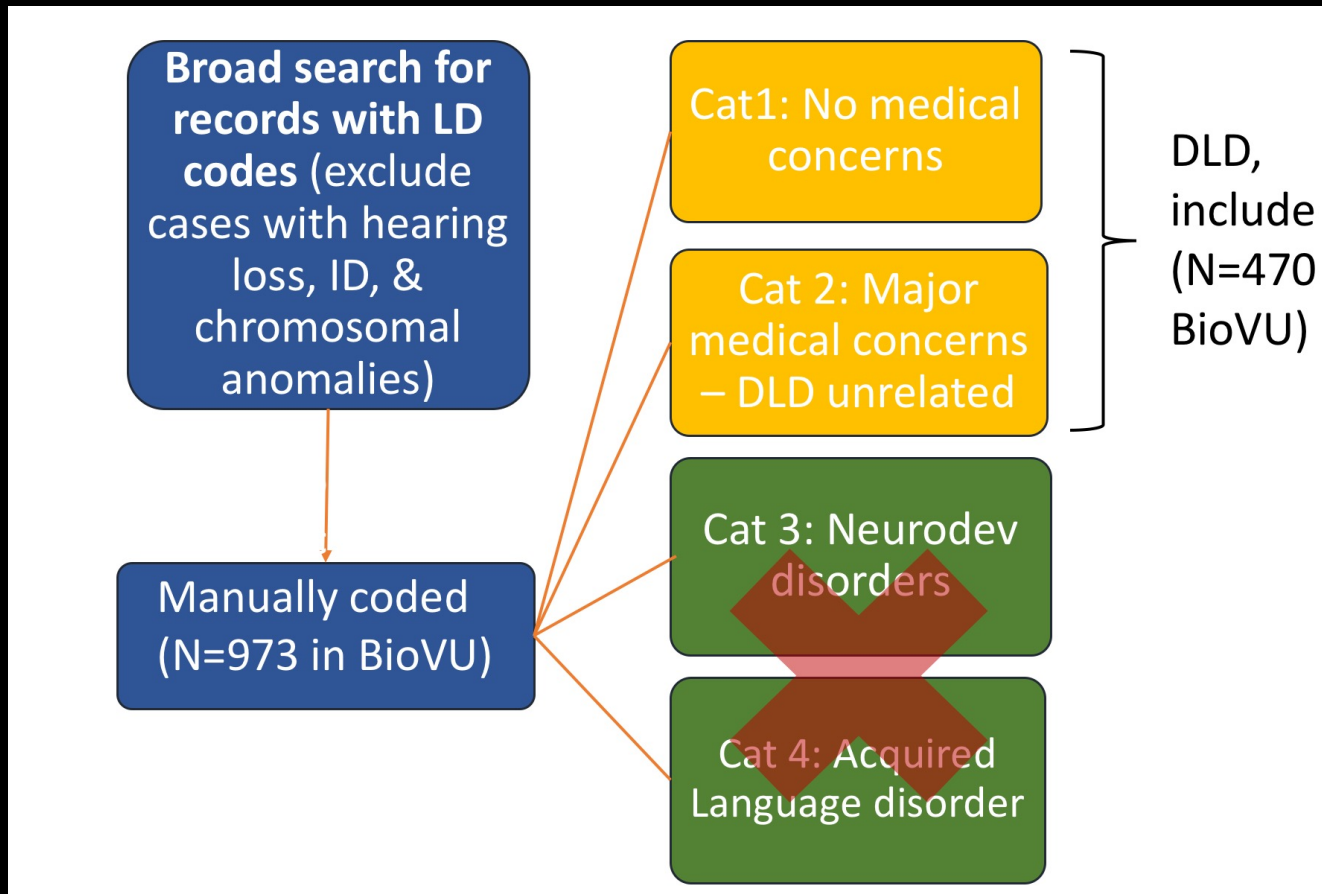
ICD-9 codes	ICD-10 codes
315.39 (Other developmental speech or language disorder)	F80.89 (Other developmental disorders of speech and language)
ICD9 code 315.32 (Mixed receptive-expressive language disorder)	F80.1 (Expressive language disorder)
ICD9 code 315.31 (Expressive language disorder)	F80.2 (Mixed receptive-expressive language disorder)



Courtney Walters

Exclude records with hearing loss, ID, known syndromes

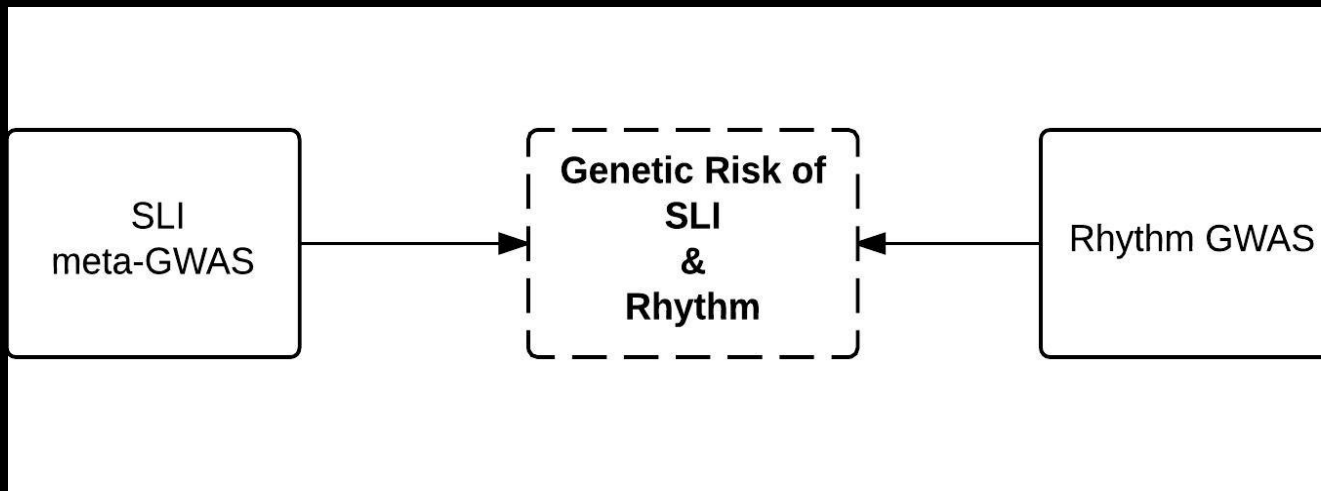
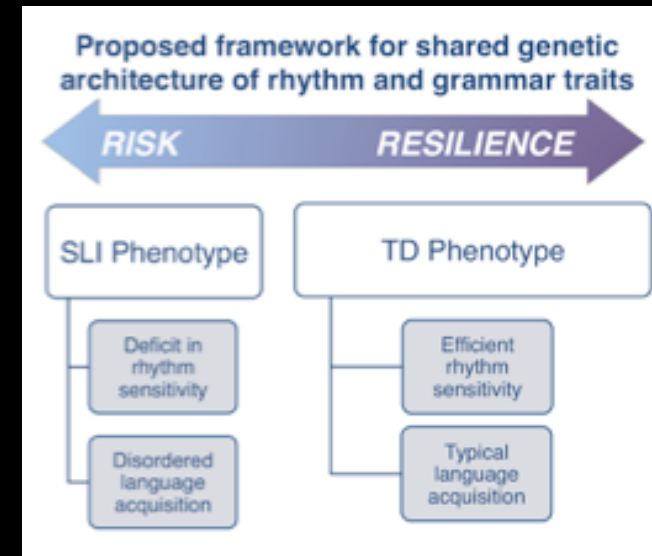
APT-DLD algorithm



Automated Phenotyping Tool for identifying **DLD** cases in health-systems data
Walters, Nitin, Margulis, Boorom, Davis, Below, Cox, Camarata & Gordon, in preparation

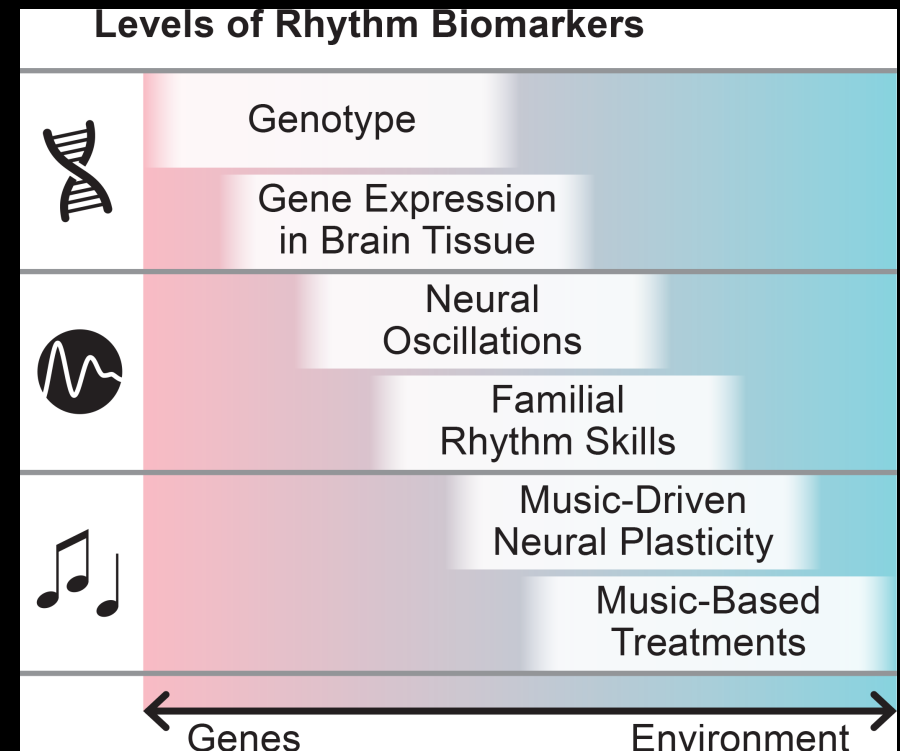
Can genetic markers of rhythm risk predict DLD?

- Polygenic risk score and genetic correlation approaches
- Shared genetic architecture?



Innovations in rhythm and grammar

What can we predict about an individual person's language based on a combination of genetic, neural, and behavioral rhythm biomarkers?





(surprising) Things I've learned

- **Sample size/power** is key. Look for cohorts that are already genotyped!
 - Also simplify phenotype data collection (can your phenotype be reduced to *one* question?)
 - International consortia and data sharing bring awesome collaborative opportunities
- You can look at **genetic correlations** between traits from *separate samples!*
- Most traits of interest are **polygenic** - involve small contributions of *many* genetics markers. There is no single “gene for rhythm”!

Wisdom from Nancy...

- **Cross-disciplinary** collaborations and training
- **Diversity** of populations, scientific backgrounds, life experiences
- **Numbers:** no one group can ascertain or learn enough on their own. Competition is out, collaboration is in!



Nancy Cox, PhD





Future directions for rhythm genomics in large cohorts

- Explore neural endophenotypes in more depth (especially gene expression in subcortical areas)
- Deeper phenotyping:
 - Objective music perception & production phenotyping - *listening games*
- GWAS on groups of non-European ancestry
- Explore relationship with genetics of speech/language
- Explore relationships with sleep/chronotype



Resources for learning best genomic approaches

- **Reading**

- Uittenlinden, 2016, Seminars in Reproductive Medicine (GWAS for dummies)
- Special issue of Psychonomic Bulletin & Review 2017 on language evolution
- Deriziotis & Fisher, 2017, Trends in Genetics (Speech & Language: Translating the Genome)
- Thompson et al, 2017, NeuroImage (ENIGMA and the individual)
- Solovieff et al, 2013, Nature Reviews Genetics (Pleiotropy and complex traits)

- **Workshops**

- International Statistical Genetics Workshop, Boulder, Colorado
<https://www.colorado.edu/ibg/workshop>
- Cognomics 2019 <https://www.mpi.nl/events/cognomics-conference-2019-bridging-gaps>
and Brain Imaging Genetics (2020?)
- Cold Spring Harbor Genetics and Neurobiology of Language workshop



Uma & Giri Peters

Acknowledgements



Fah Sathirapongsasuti, Liz Noblin, and the
23andMe Research Team

Vanderbilt Music Cognition Lab
Rhythm & Grammar team
Rachana Nitin, CJ Walters, Kate Margulis

Vanderbilt Bill Wilkerson Center
Stephen Camarata

Vanderbilt Genetics Institute
Piper Below, Lauren Petty, Don Hucks

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Special thanks to:
KNAW for sponsoring the
Master Class & Colloquium



Henkjan Honing, Simon Fisher,
and Bruno Gingras



Thank you for your
attention!