



ENIGMA-EPILEPSY

A coordinated case-control analysis of 3,876 individuals at 21 sites worldwide

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EPILEPSY

“A history of deities and demons, of spirits and curses... thus a history of human suffering and medical ignorance.”

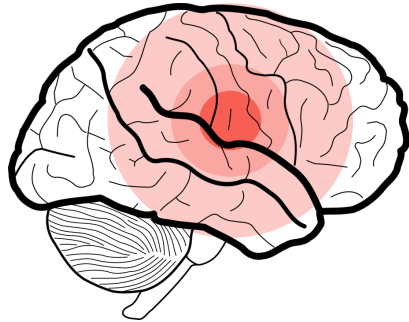
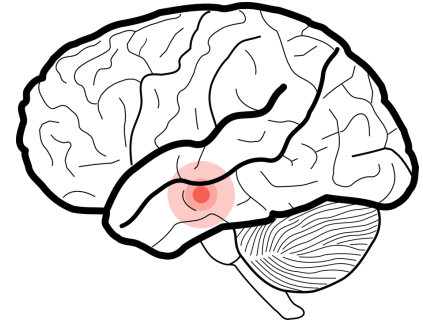
- Donald F. Weaver



MRI in epilepsy: Unanswered questions

Temporal lobe epilepsy (MTLE)...

- ▶ What is the extent of extrahippocampal atrophy, associated with **mesial temporal sclerosis (MTS)**?
- ▶ Are abnormalities more pronounced in **left** vs. **right** MTLE?



Genetic generalized epilepsy (GGE)

- ▶ Which brain regions are affected? Thalamo-cortical circuitry?¹

MRI in epilepsy: Unanswered questions

▶ Small, cross-sectional neuroimaging studies are **underpowered** to detect subtle effects, and may **over-inflate** other effects.

nature
REVIEWS | NEUROSCIENCE

ANALYSIS

Power failure: why small sample size undermines the reliability of neuroscience

Katherine S. Button^{1,2}, John P. A. Ioannidis⁵, Claire Mokrysz¹, Brian A. Nosek³, Jonathan Flint⁶, Emma S. J. Robinson⁶ and Marcus R. Munafò¹

Abstract | A study with low statistical power has a reduced chance of detecting a true effect, but it is less well appreciated that low power also reduces the likelihood that a statistically significant result reflects a true effect. Here, we show that the average statistical power of

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Cluster failure: Why fMRI inferences for spatial extent have inflated false-positive rates

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Edited by Emery N. Brown, Massachusetts General Hospital, Boston, MA, and approved May 17, 2016 (received for review February 12, 2016)

The most widely used task functional magnetic resonance imaging (fMRI) analyses use parametric statistical methods that depend on a variety of assumptions. In this work, we use real resting-state data and a total of 2.7 million random, task-rest, analyses, for comparison

empirical
FSL, and
nominal
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comparison, the nonparametric permutation test is found to produce nominal results for voxelwise as well as clusterwise inference. These findings speak to the need of validating the statistical methods being used in the field of neuroimaging.

fMRI | statistics | false positives | cluster inference | permutation test

Since its beginning more than 20 years ago, functional magnetic resonance imaging (fMRI) (1, 2) has become a popular tool for understanding the human brain, with some 40,000 published papers according to PubMed. Despite the popularity of fMRI as a tool for studying brain function, the statistical methods used have rarely been validated using real data. Validations have instead

(FWE), the chance of one or more false positives, and empirically measure the FWE as the proportion of analyses that give rise to any significant results. Here, we consider both two-sample and

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nally statistically
ie effect. We dis-

“...the most common software packages... (SPM, FSL, AFNI)... can result in false-positive rates of up to 70%”

each voxel, and clusterwise inference (19–21), where significance is assessed on clusters formed with an arbitrary threshold.

In brief, we find that all three packages have conservative voxelwise inference and invalid clusterwise inference, for both one- and two-sample t tests. Alarming, the parametric methods can give a very high degree of false positives (up to 70%, compared with the nominal 5%) for clusterwise inference. By comparison, the nonparametric permutation test (22–25) is found to produce nominal results for both voxelwise and clusterwise inference for two-sample t tests, and nearly nominal results for one-sample t tests. We explore why the methods fail to appropriately control the false-positive risk.

Study design

Phenotypes:

- ▶ MTLE with left MTS • **N= 415**
- ▶ MTLE with right MTS • **N= 339**
- ▶ GGE • **N = 367**
- ▶ 'All epilepsies' • **N = 2,149**
- ▶ Healthy controls • **N= 1,727**

Inclusion criteria:

- ▶ Aged 18-55 years
- ▶ No strokes, infarcts, tumors
- ▶ No neurosurgery
- ▶ No neurological co-morbidities, or progressive syndromes (e.g. FCDs, PMEs)

Genetic determinants of common epilepsies: a meta-analysis of genome-wide association studies



International League Against Epilepsy Consortium on Complex Epilepsies*



Summary

Background The epilepsies are a clinically heterogeneous group of neurological disorders. Despite strong evidence for heritability, genome-wide association studies have had little success in identification of risk loci associated with epilepsy, probably because of relatively small sample sizes and insufficient power. We aimed to identify risk loci through meta-analyses of genome-wide association studies for all epilepsy and the two largest clinical subtypes (genetic generalised epilepsy and focal epilepsy).

Lancet Neurol 2014;
13: 893-903

Published Online
July 31, 2014

[http://dx.doi.org/10.1016/S1474-4422\(14\)70171-1](http://dx.doi.org/10.1016/S1474-4422(14)70171-1)

See Comment page 859

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Methods We combined genome-wide association data from 12 cohorts of individuals with epilepsy and controls from population-based datasets. Controls were ethnically matched with cases. We phenotyped individuals with epilepsy into categories of genetic generalised epilepsy, focal epilepsy, or unclassified epilepsy. After standardised filtering for quality control and imputation to account for different genotyping platforms across sites, investigators at each site conducted a linear mixed-model association analysis for each dataset. Combining summary statistics, we conducted fixed-effects meta-analyses of all epilepsy, focal epilepsy, and genetic generalised epilepsy. We set the genome-wide significance threshold at $p < 1.66 \times 10^{-8}$.

Findings We included 8696 cases and 24 157 controls in our analysis. Meta-analysis of the all-epilepsy cohort identified a risk locus at 2q24.2 ($p = 8.71 \times 10^{-9}$), implicating *SGNDA*, and at 4p15.1 ($p = 5.44 \times 10^{-9}$), harbouring *PCDH7*, which encodes a protein adhesion molecule not previously implicated in epilepsy. For the cohort of genetic generalised epilepsy, we noted a single signal at 2p16.1 ($p = 9.99 \times 10^{-9}$) implicating *VRK2* on *P4* NCL. No single nucleotide polymorphism achieved genome-wide significance for focal epilepsy.



Methods • Overview

**Run post-processing
on MRI data**
(FreeSurfer v5.3.0)



Perform image QC
(standardized ENIGMA QA
guidelines)



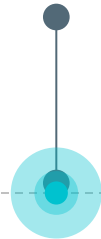
**Conduct linear
regression**
(R, *lm*; covariates =
AGE, SEX, ICV)



**Upload [anon.] summary
statistics to ENIGMA server**
cranium.ini.usc.edu



**Run random-effects
meta-analysis**
(R, *metafor*, $p < 1.84 \times 10^{-4}$)



Subcortical results

(A) ALL EPILEPSIES:

- Bilateral thalamus ($d_s = -0.348$; $P \leq 1.31 \times 10^{-6}$)
- Bilateral hippocampi ($d_s = -0.336$; $P \leq 3.04 \times 10^{-7}$)
- Right pallidum ($d = -0.316$; $P = 8.32 \times 10^{-9}$),
- Bilateral lat. ventricles ($d < 0.268$; $P \leq 2.14 \times 10^{-12}$)

(B) TLE-MTS-L:

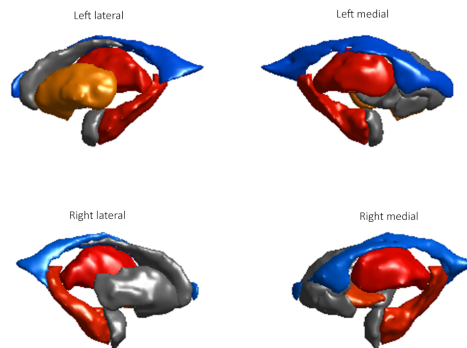
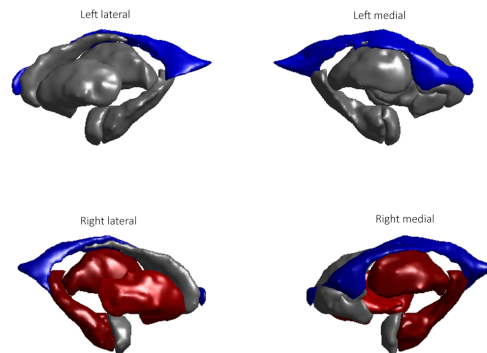
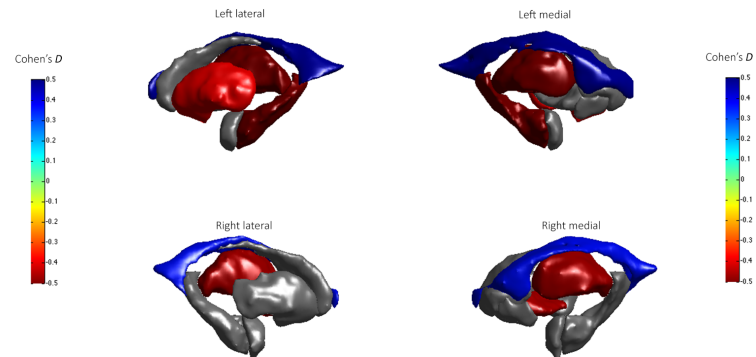
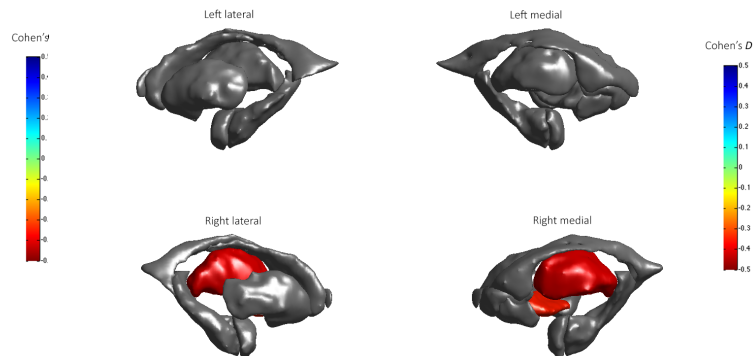
- ipsilateral hippocampus ($d = -1.73$; $P = 1.35 \times 10^{-19}$),
- bilateral thalamus ($d_s = -0.462$; $P \leq 8.12 \times 10^{-5}$),
- contralateral pallidum ($d = -0.45$; $P = 5.48 \times 10^{-7}$)
- ipsilateral putamen ($d = -0.385$; $P = 1.07 \times 10^{-6}$),
- bilateral lat. ventricles ($d \geq 0.36$; $P \leq 8.95 \times 10^{-5}$)

(C) TLE-MTS-R:

- ipsilateral hippocampus ($d = -1.906$; $P = 6.36 \times 10^{-37}$)
- ipsilateral thalamus ($d = -0.727$; $P = 1.60 \times 10^{-12}$)
- ipsilateral putamen ($d = -0.47$; $P = 4.94 \times 10^{-4}$)
- ipsilateral pallidum ($d = -0.451$; $P = 3.96 \times 10^{-7}$)
- bilateral lat. ventricles ($d \geq 0.39$; $P \leq 1.52 \times 10^{-6}$)

(D) GGE:

- right thalamus ($d = -0.403$; $P = 3.6 \times 10^{-6}$)
- right pallidum ($d = -0.35$; $P = 3.37 \times 10^{-4}$)

A. All epilepsies**C. Temporal lobe epilepsy with right MTS****B. Temporal lobe epilepsy with left MTS****D. Genetic generalized epilepsies**

Cortical results

(A) ALL EPILEPSIES:

BILATERAL changes in...

- precentral gyri ($d \leq -0.384$; $P \leq 1.82 \times 10^{-18}$),
- caudal middle frontal gyri ($d \leq -0.307$; $P \leq 2.09 \times 10^{-9}$),
- paracentral gyri ($d \leq -0.311$; $P \leq 2.05 \times 10^{-6}$),
- pars triangularis ($d \leq -0.192$; $P \leq 1.29 \times 10^{-4}$),
- superior frontal gyri ($d \leq -0.342$; $P \leq 1.44 \times 10^{-9}$),
- transverse temporal gyri ($d \leq -0.342$; $P \leq 1.29 \times 10^{-4}$),
- supramarginal gyri ($d \leq -0.232$; $P \leq 9.87 \times 10^{-5}$).

UNILATERAL changes in...

- right cuneus ($d = -0.204$; $P = 9.68 \times 10^{-8}$),
- right pars opercularis ($d = -0.177$; $P = 6.48 \times 10^{-7}$),
- right precuneus ($d = -0.275$; $P = 2.7 \times 10^{-5}$)
- left entorhinal gyrus ($d = -0.264$; $P = 2.04 \times 10^{-5}$)

(B) TLE-MTS-L:

BILATERAL changes in...

- caudal middle frontal gyri ($d \leq -0.403$; $P \leq 7.07 \times 10^{-9}$),
- paracentral gyri ($d \leq -0.378$; $P \leq 1.61 \times 10^{-5}$),
- precentral gyri ($d \leq -0.466$; $P \leq 8.64 \times 10^{-9}$)
- superior frontal gyri ($d \leq -0.365$; $P \leq 1.44 \times 10^{-9}$)

UNILATERAL changes in...

- ipsi. entorhinal cortex ($d = -0.445$; $P = 7.35 \times 10^{-10}$)
- ipsi. fusiform gyrus ($d = -0.359$; $P = 2.19 \times 10^{-7}$),
- ipsi. temporal pole ($d = -0.315$; $P = 3.33 \times 10^{-6}$),
- contra. precuneus ($d = -0.473$; $P = 5.16 \times 10^{-6}$)
- contra. pars triangularis ($d = -0.285$; $P = 2.16 \times 10^{-6}$)

(C) TLE-MTS-R:

BILATERAL changes in...

- paracentral gyri ($d \leq -0.421$; $P \leq 7.67 \times 10^{-7}$),
- precentral gyri ($d \leq -0.415$; $P \leq 4.31 \times 10^{-6}$),

UNILATERAL changes in...

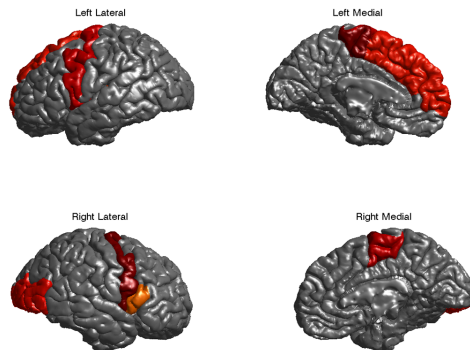
- ipsi. lateral occipital gyrus ($d = -0.366$; $P = 1.79 \times 10^{-4}$)
- ipsi. pars opercularis ($d = -0.271$; $P = 1.45 \times 10^{-4}$)
- contra. superior frontal gyrus ($d = -0.355$; $P = 1.59 \times 10^{-4}$)
- contra. transverse temporal gyrus ($d = -0.312$; $P = 2.15 \times 10^{-5}$)

(D) GGE:

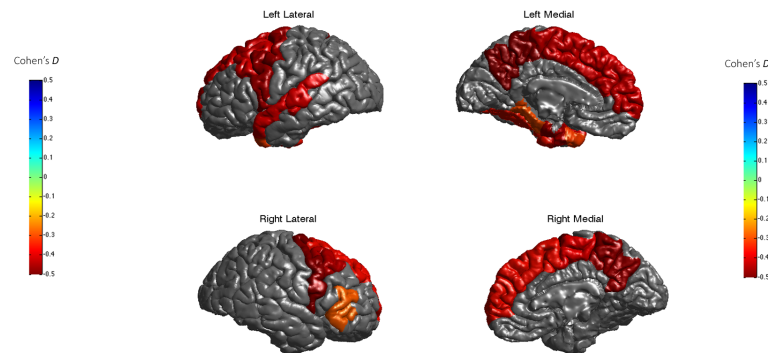
BILATERAL changes in...

- precentral gyri ($d \leq -0.342$; $P \leq 1.75 \times 10^{-6}$)

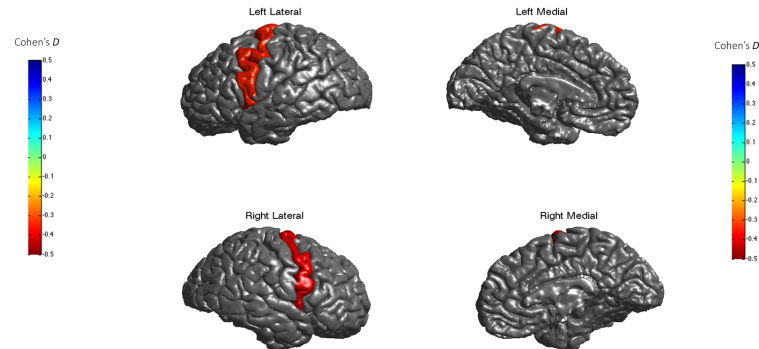
C. Temporal lobe epilepsy with right MTS



B. Temporal lobe epilepsy with left MTS



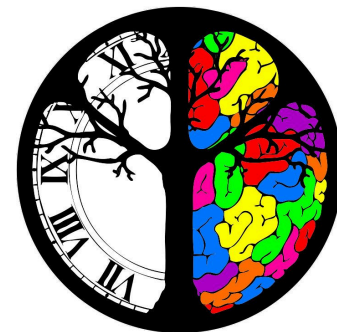
D. Genetic generalized epilepsies



Results • Effects of duration, age at onset, age*Dx

Duration effects...

- Observed in 'all epilepsies' and MTLE-MTS-R groups.
- *Precentral gyri, thalamus, hippocampus, pars triangularis, superior frontal gyri.*



Age at onset effects...

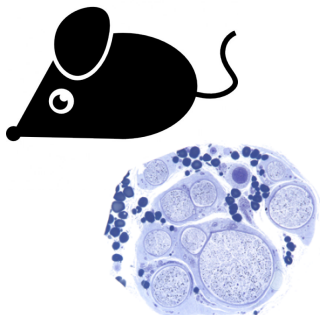
- Observed in 'all epilepsies' group only.
- *Superior frontal gyri, pars triangularis, transverse temporal gyrus.*

Age*Diagnosis effects...

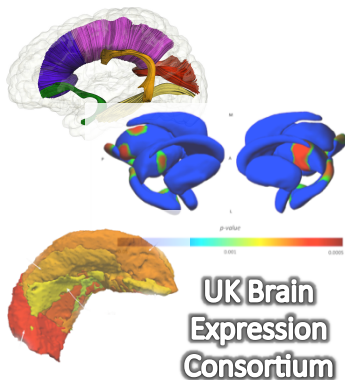
- None observed after correction for multiple comparisons.



Discussion



- ▶ Specific functional implications **cannot be inferred** from GM changes alone.
- ▶ How, then, can our findings help?
 - ▶ Confirm / refute prior reports from smaller studies
 - ▶ ROI prioritization, e.g. neuropathology • animal models • gene expression

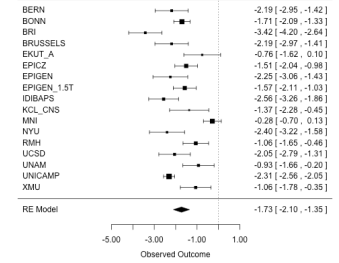


- ▶ **Many other** ENIGMA-Epilepsy groups are **active**, or will **soon form**...
 - ▶ ENIGMA-Epilepsy **DTI (ongoing)**
 - ▶ ENIGMA-Epilepsy **Subcortical Shape**
 - ▶ ENIGMA-Epilepsy **Hippocampal Subfields**
 - ▶ **Sulcal/gyrification** measures
 - ▶ Expression studies, in collab w/ **UKBEC**
 - ▶ Eventual **imaging genetics** in epilepsy

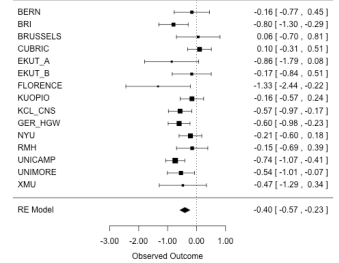
ENIGMA-EPILEPSY

- ▶ Largest neuroimaging study of epilepsy to date.
- ▶ Shows **profound, robust, and consistent effects** across and within syndromes.
- ▶ Must be wary of **limitations**: Cross-sectional design, omission of certain covariates.
- ▶ An open, collaborative network aiming to identify **structural biomarkers**.

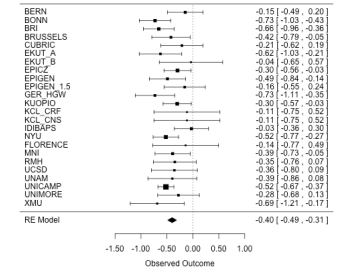
Hippocampus (left) • MTL-MTS-L



Thalamus (right) • GGE



Precentral gyrus (right) • All epilepsies



THANK YOU!



NIH Big Data to
Knowledge (BD2K)

Chantal Depond
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Niels Föcke

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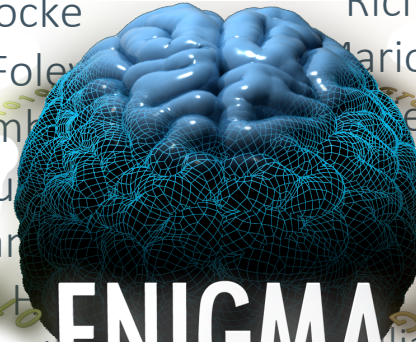
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