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Rare risk variants associate with epigenetic dysregulation in migraine

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1 Title: Rare risk variants associate with epigenetic dysregulation in migraine

2

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21 ABSTRACT

- 22
- 23 Migraine has a heritability of up to 65%. Genome-wide association studies (GWAS) on migraine
- 24 have identified 123 risk loci, explaining only 10.6% of migraine heritability. Thus, there is a NOTE: This preprint reports new research that has not been certified by peer review and should not be used to guide clinical practice.

considerable genetic component not identified with GWAS. Further, the causality of the identified 25 risk loci remains inconclusive. Rare variants contribute to the risk of migraine but GWAS are often 26 27 underpowered to detect these. Whole genome sequencing is reliable for analyzing rare variants but is not frequently used in large-scale. We assessed if rare variants in the migraine risk loci associated 28 with migraine. We used a large cohort of whole genome sequenced migraine patients (1,040 29 individuals from 155 families). The findings were replicated in an independent case-control cohort 30 (2,027 migraine patients, 1,650 controls). We found rare variants (minor allele frequency<0.1%) 31 32 associated with migraine in a Polycomb Response Element in the ASTN2 locus. The association was independent of the GWAS lead risk variant in the locus. The findings place rare variants as risk 33 factors for migraine. We propose a biological mechanism by which epigenetic regulation by 34 35 Polycomb Response Elements plays a crucial role in migraine etiology.

36

37 INTRODUCTION

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Migraine is a complex neurovascular and genetic disorder which affects 15-20% of the population.¹ 39 It is characterized by episodes of severe headache, which is typically unilateral and pulsating, 40 accompanied by nausea, vomiting, photophobia and/or phonophobia.² Identifying factors that 41 predispose to migraine is highly relevant. The Global Burden of Disease Study (2019) ranks 42 migraine the highest cause of disability worldwide in young women (aged 15-49) and the second 43 highest cause of disability worldwide among both sexes.³ Additionally, migraine has a large 44 socioeconomic impact through treatment costs and loss of productivity estimated at €27 billion in 45 Europe alone.⁴ 46

Migraine has a significant genetic component and is polygenic. There is an increased familial risk 48 and twin studies have shown a heritability of 34%-65%.^{5,6} Multiple, rare variants, each with large 49 effect sizes, may contribute to disease risk together with common variants.^{7,8} The most recent meta-50 analysis of migraine genome-wide association studies (GWAS) identified 123 migraine risk loci, of 51 which 121 were autosomal. Still, only 10.6% of the total heritability was explained by the GWAS.⁹ 52 GWAS are often underpowered to detect rare variants, as these are imputed and not measured.¹⁰ 53 Whole genome sequencing (WGS) provides a direct assessment of rare variants. However, it is a 54 technology that is still not frequently used in large-scale and is costly compared to genotyping using 55 arrays. 56

How the migraine risk loci affect migraine pathogenesis is unknown. Many reside in non-protein coding regions of the DNA and may alter the regulation of gene expression.¹¹ Increased risk of migraine has been linked to disruption in gene regulation¹² and epigenetic regulation.^{12–14} While candidate genes have been identified for increased genetic risk in migraine, the findings have been reported with a high risk of false positive results.^{15–18} This suggests that migraine pathogenesis is affected by mutations outside of protein-coding regions of the DNA, such as in regulatory regions.

63

We hypothesized that migraine is influenced by rare variants in regulatory regions. We tested if rare 64 variants in the migraine risk loci increase the risk of migraine. We defined blocks of linkage 65 66 disequilibrium (LD) around the 121 autosomal GWAS lead risk variants using a Danish cohort of 90,312 individuals.^{9,19} Within the LD-blocks, we analyzed rare variants (minor allele frequency 67 (MAF)<0.1%, MAF<1%, and MAF<5%) in genes and regulatory regions using a Sequence Kernel 68 69 Association Test. For the analysis, we used WGS data from a large cohort of 155 families $(n_{individuals}=1.040)$ with clustering of migraine. The findings were replicated in an independent case-70 71 control cohort of migraine patients with no familial history of migraine and controls.

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73 MATERIALS AND METHODS

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75 Migraine family cohort

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The migraine family cohort consisted of 155 families with a Mendelian-like inheritance pattern of 77 migraine. The participants were recruited from the Danish Headache Center, Rigshospitalet-78 Glostrup, Denmark, as described elsewhere.^{20,21} All participants were examined by a neurology 79 resident or a senior medical student specifically trained in headache diagnostics. The participants 80 were examined using a semi-structured interview^{22,23} based on the International Classification of 81 Headache Disorders.² The families consisted of 1.040 participants, including 746 individuals 82 diagnosed with migraine and 294 without migraine. The mean number of participants per family 83 was 6.7 and the mean number of migraine patients per family was 4.8. Most of the families were 84 extended beyond the nuclear family. The smallest families consisted of at least two individuals with 85 at least one migraine patient. 86

87

88 Replication cohort

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90 The replication cohort consisted of 2,027 migraine patients with no familial history of migraine, i.e. 91 unrelated migraine patients, and 1,650 controls. The unrelated migraine patients were recruited and 92 assessed at the Danish Headache Center using the same procedures as described for the family 93 cohort. The controls were recruited for the Danish study of Non-Invasive testing in Coronary Artery 94 Disease (Dan-NICAD) according to procedures described by Nissen *et al.*.²⁴

96 Whole genome sequencing

97

98 Blood samples were taken from all participants and genomic DNA was extracted from whole blood.
99 The sequencing was performed on an Illumina NovaSeq 6000 sequencing platform with S4 flow
100 cells. The WGS data was subjected to quality control by deCODE genetics, as described
101 elsewhere.²⁵ All samples from both the migraine family cohort and the replication cohort were
102 subjected to the same sequencing and quality control procedures.

103

104 Analytical approach

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106 Selecting genomic regions for analysis

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We calculated blocks of linkage disequilibrium (LD) around the 121 autosomal migraine risk loci,⁹ 108 using the genomic positions of the GWAS lead risk variants, i.e. the variants with the smallest 109 GWAS *p*-value. For this we used 90,312 participants from the Danish Blood Donor Study 110 (DBDS).¹⁹ The genomic positions of the GWAS lead risk variants were based on SNP positions 111 from the Database of Single Nucleotide Polymorphisms (dbSNP) build 153 in the GRCh38.p12 112 (hg38) assembly. The LD-blocks were calculated using a LD-block recognition algorithm proposed 113 by Gabriel et al.²⁶ with PLINK2.²⁷ Here, we assessed variant-pairs within 1000 kilobases of each 114 other with a MAF>5% using a 90% D' confidence interval threshold >0.70. Subsequently, we 115 annotated genes and regulatory regions within the LD-blocks and analyzed these. If a LD-block 116 117 partially spanned a gene or regulatory region, we included the entire gene or regulatory region in the analysis. If a LD-block was located in an intergenic region, we extended the genomic region for 118 analysis to include the nearest protein- or RNA-coding gene. No LD-block was generated for 22 119

loci. In such case, the nearest protein- or RNA-coding gene was included in the analysis. Thegenomic positions of the regions we analyzed are found in Table S1.

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123 Annotating genes and regulatory regions for analysis

124

The gene transcripts were derived from GENCODE release 36 (basic gene-set only). They included 125 protein-coding genes, non-coding RNA-genes, and pseudogenes. We analyzed the genes in their 126 full length. In addition, we analyzed the coding exons, introns, 5' untranslated regions (UTR) 127 exons, and 3' UTR exons by themselves. For regulatory regions, we analyzed promoters, enhancers, 128 CpG islands, insulators, Polycomb Response Elements (PREs), and Transcription Factor Binding 129 130 Sites (TFBSs). We included promoters from The Eukaryotic Promoter Database (EPD) version 6 and EPD non-coding promoters version 1.28 The enhancers were included from the GeneHancer 131 project,²⁹ using only enhancers that are supported by multiple studies. The genomic positions of the 132 CpG islands were based on predictions by Gardiner-Garden et al.³⁰ The insulators and PREs were 133 included from the Broad Institute Chromatin State Segmentation by HMM³¹ from The 134 Encyclopedia of DNA Elements (ENCODE) Consortium³² in H1-hESC cells in the GRCh37 (hg19) 135 assembly. The TFBS were included from ENCODE³² in the GRCh37 (hg19) assembly. All genomic 136 positions in hg19 were converted to the CRCh38 (hg38) assembly. Table S2 displays the number of 137 genes and regulatory regions that were analyzed in this study. 138

139

140 Preparing VCF files for analysis

141

142 The VCF files of each participant in the study were merged into one file. Multiallelic sites were 143 converted to a biallelic representation. Subsequently, we annotated genes and regulatory regions to

the merged VCF file. We isolated variants, including SNVs, insertions, and deletions, with a
 MAF<0.1%, MAF<1%, or MAF<5%, using BCFtools.³³

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147 Rare variant association analysis

148

To test for an association between the rare variants in genes or regulatory regions and migraine, we 149 used the software of Family Sequence Kernel Association Test (F-SKAT).³⁴ Age and gender were 150 used as covariates. The age was defined as the age at the time of the interview (time of diagnosis). 151 To avoid association merely given that longer genes and regulatory regions can contain more rare 152 variants, we used modified beta-values.³⁵ The beta-values were modified by dividing them with the 153 154 length of the genes or regulatory regions. The *p*-values were controlled for multiple testing using the Bonferroni method based on the number of genes and regulatory regions tested. A Bonferroni-155 corrected *p*-value<0.05 was considered significant. 156

To assess if the results were dependent of the GWAS lead risk variants, the number of risk alleles of the variants (0, 1, or 2) were included as covariates in a separate rare variant association analysis with F-SKAT.

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161 Replication

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163 The findings were replicated using an independent cohort of unrelated migraine patients and 164 controls. Aggregated data were available on rare variants (MAF<0.1%, MAF<1%, MAF<5%) in 165 the genes and regulatory regions for the controls. We tested if the frequency of the rare variants was 166 increased in the migraine patients compared with the controls, using a Fisher's Exact Test.³⁶ We 167 used the null hypothesis of no association with migraine under a dominant model of penetrance.

168 The resulting *p*-values were controlled for multiple testing using the Bonferroni method. A
169 Bonferroni-corrected *p*-value<0.05 was considered significant.

170

171 Characterization of findings

172

To explore the effect of the rare variants of the replicated results, we used Ensembl Variant Effect Predictor.³⁷ To discover the target genes of the replicated results, we used *cis*-eQTLs data from the Genotype-Tissue Expression (GTEx) version 8.0 dataset (dbGaP Accession phs000424.v8.p2 release).

177

178 **Ethics**

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Oral and written consent was obtained from all participants. All procedures performed in studies involving human participants were in accordance with the ethical standards of the National Committee on Health Research Ethics (file no. H-2-2010-122) and with the 1964 Helsinki declaration and its later amendments. The study was approved by the data-protection agency (01080/GLO-2010-10).

185

186 **RESULTS**

187

188 Rare variants in regulatory regions associate with migraine

189

We found an association between migraine and rare variants with a MAF<0.1% in 7 regulatory regions and an intron of the *MACF1* gene (see Table 1 for genomic regions and *p*-values). No

association was found for rare variants with a MAF<1% or a MAF<5% nor in coding regions (full gene transcripts, coding exons, 5' UTR exons, 3' UTR exons). In line with what is expected when analyzing rare variants for polygenic traits,^{9,38,39} we found that the distribution of the test statistics deviated from the null with inflated genomic inflation factors (λ =1.89, λ =1.63, and λ =1.68) (Figure S1).

197

Subsequently, we replicated the Polycomb Response Element (PRE) located at chr9:117,411,901-117,412,101 in the *ASTN2* locus ($p=1.1\cdot10^{-15}$) using an independent case-control cohort, henceforth referred to as the replicated PRE.

201

We found that the findings were independent of the GWAS lead risk variants, with unaffected results ($p=1.3\cdot10^{-4}$ in the original analysis (see Table 1) and $p=1.2\cdot10^{-4}$ with the allele count of the risk variants as covariates).

205

Table 1. Summary of the results obtained from the rare variant association analysis. The results from the rare variant association analysis together with the locus ID, as given in the metaanalysis of migraine GWAS by Hautakangas *et al.*⁹, the genomic positions in GRCh38.p12 (hg38), and type of genomic feature.

Locus ID Genomic positions		Туре	<i>p</i> -value	Corrected <i>p</i> -value		
MACF1	chr1:39,303,078-39,309,569	Intron	$1.8 \cdot 10^{-5}$	0.019		
THADA	chr2:43,400,466-43,400,944	Transcription	5.3·10 ⁻⁶	0.013		
		Factor Binding Site				

PHACTR1	chr6:12,748,985-12,750,439	Enhancer	1.0.10-4	0.021
ASTN2	chr9:117,411,901-117,412,101	Polycomb	1.3.10-4	0.012
		Response Element		
near	chr11:133,939,661-133,940,767	CpG island	1.9.10-4	0.027
SPATA19				
	chr14:26,917,154-26,917,554	Insulator	1.2.10-4	0.014
near LRFN5	chr14:41,610,647-41,610,847	Polycomb	6.7.10-5	6.2·10 ⁻³
		Response Element		
	chr14:41,610,658-41,610,787	Enhancer	6.7.10-5	0.028

211

212 Rare variants in PRE map to CTCF binding sites

213

The replicated PRE was located in the first intron of the *ASTN2* gene and overlapped the TFBS of

215 CTCF, SIN3A, ZNF444, GATA2, RCOR1, and MYC (Figure 1). There were 12 rare variants with

a MAF<0.1% located in the replicated PRE. These rare variants consisted of 1 SNV, 9 deletions,

and 2 insertions (Table 2). We found that all rare variants mapped to CTCF binding sites (Table 2)

218 using the Ensembl Variant Effect Predictor (VEP).



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Figure 1. Overview of the genomic region around the ASTN2 migraine risk locus. Top: The 222 genomic region that was included for analysis (see Table S1 for genomic positions). Displayed is 223 the GWAS lead risk variant (rs3891689), the replicated Polycomb Response Element, and the genes 224 included for analysis. Bottom: A close-up of the replicated Polycomb Response Element and its 225 surrounding genomic region. Displayed are the rare variants with a MAF<0.1%, that associated 226 with migraine, the replicated Polycomb Response Element, near-by regulatory regions (an insulator 227 228 and 17 transcription factor binding sites), the first intron of the ASTN2 gene, and the evolutionary conservation across 100 vertebrates. 229

Table 2. Information on the rare variants in the replicated Polycomb Response Element. The
table presents the genomic positions in GRCh38.p12 (hg38), the reference allele, the alternative

- allele, the variant type, the rs number, and the Ensembl regulatory feature of the rare variants
- 234 (MAF<0.1%) in the replicated Polycomb Response Element.

Genomic position	Reference allele	Alternative allele	Variant	rs number	Ensembl
			type		regulatory feature
chr9:117411967-	А	С	SNV	rs866789329	CTCF binding site
117411967					
chr9:117411977-	CCACCCCTACCA	С	Deletion		CTCF binding site
117411988					
chr9:117411978-	CACCCCTACCACCA	С	Deletion	rs158802387	CTCF binding site
117411991				2	
chr9:117411983-	CTACCA	С	Deletion	rs144647713	CTCF binding site
117411997				7	
chr9:117411983-	CTACCACCA	С	Deletion		CTCF binding site
117411991					
chr9:117411983-	CTACCACCACCCCC	С	Deletion		CTCF binding site
117411988	А				
chr9:117411990-	СА	С	Deletion		CTCF binding site
117411991					
chr9:117411996-	CACCTCACCCCT	С	Deletion		CTCF binding site
117412007					
chr9:117411999-	СТСА	С	Deletion	rs138331219	CTCF binding site
117412002				5	
chr9:117412007-	TC	Т	Deletion	rs145255224	CTCF binding site
117412008					
chr9:117412018-	А	ACCCCCCCCC	Insertion		CTCF binding site
117412018					
chr9:117412018-	A	ACCCCCCCCC	Insertion		CTCF binding site
117412018		С			

235

236 **Possible regulatory targets unidentified**

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- Finally, we assessed the possible regulatory targets of the replicated PRE. We found no significant
- *cis*-eQTLs in the PRE using the GTEx database for the identification of regulatory targets.

240

241 **DISCUSSION**

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Our study is, to our knowledge, the first to assess if rare variants in 121 autosomal migraine risk loci increase the risk of migraine. We assessed if rare variants in genes and regulatory regions associated with migraine, using WGS data from families with clustering of migraine. We replicated a Polycomb Response Element (PRE) in the *ASTN2* locus using an independent case-control cohort.

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248 Regulatory regions harbor rare variants associated with migraine

249

We found an association between migraine and rare variants with a MAF<0.1% in 7 regulatory 250 regions and an intron of the MACF1 gene. Our results indicate that migraine can be associated with 251 rare variants in regulatory regions, since introns are likely to harbor elements with a regulatory 252 function.⁴⁰ We replicated a PRE in the ASTN2 locus using an independent case-control cohort. 253 Interestingly, we have previously reported a rare variant association with migraine in a PRE in the 254 same locus, using a different study design.¹² Importantly, we show that the effect of the replicated 255 256 PRE was independent of the GWAS lead risk variant. Thus, our results show that migraine GWAS loci also contain independent rare risk variants. 257

Disruption in epigenetic regulation as a possible biological mechanism for migraine 259

260

The function of mammalian PREs is still largely unknown.⁴¹ Mammalian PREs are likely capable 261 of binding Polycomb Group (PcG) proteins as a part of transcriptional silencing during cell 262 division, where the silencing is maintained in subsequent daughter cells.⁴¹⁻⁴³ Associated with the 263 silencing is remodeling of the chromatin.^{44,45} Possibly, the rare variants we find associated with 264 migraine in the replicated PRE can cause a disruption in the binding of PcG proteins and chromatin 265 remodeling. The disruption may lead to transcriptional silencing not being maintained after cell 266 division. This ultimately leads to an altered gene expression (Figure 2). Epigenetic mechanisms 267 have been linked to brain plasticity in the transition from episodic to chronic migraine.^{13,14} 268 269 However, we are, to our knowledge, the first to report an indication of an actual biological mechanism for migraine, where chromatin remodeling is disrupted by rare variants in PREs. 270

271

We found that the rare mutations in the replicated PRE were situated in binding sites of the 272 transcription factor CTCF. CTCF is a transcriptional repressor, with many functions including 273 regulation of gene expression through chromatin modifications.⁴⁶ Again, our findings indicate a link 274 to a disruption in chromatin remodeling as a biological mechanism for migraine. 275



Figure 2. Schematic overview of transcriptional silencing by PcG proteins in absence or 278 presence of rare variants in the DNA. A. The recruitment of PcG proteins to the DNA results in 279 transcriptional silencing that is maintained after cell division. **B.** A disruption of PcG binding, e.g. 280 281 by rare variants, results in no binding or a weakened binding of the PcG proteins. A disrupted binding leads to an altered gene expression where gene silencing is disturbed. The altered gene 282 expression is maintained after cell division. 283

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ASTN2 as a possible regulatory target gene 285

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We were not able to identify regulatory targets of the replicated PRE based on significant cis-287 eQTLs. Thus, the target gene could be assigned to the nearest gene, as done by Ringrose et al..47 288 The nearest gene is ASTN2, of which the PRE is overlapping. The ASTN2 gene encodes the 289 Astrotactin 2 protein. The Astrotactin 2 protein is expressed in the brain and is suggested to play a 290

part in neuronal migration. Thus, our findings support the hypothesis of migraine being a neuronal
 disorder.⁴⁸

293

294 Implications for genetic studies on migraine

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The most recent meta-analysis of migraine GWAS only explains 10.6% of the total heritability of 296 migraine.⁹ GWAS are often underpowered to detect rare variants with low-penetrant alleles.¹⁰ We 297 298 found that migraine associated with very rare variants, i.e. variants with a MAF<0.1%, in the migraine risk loci. Our results indicate that a part of the unexplained heritability of migraine could 299 300 arise from rare variants not detected by GWAS. Also, our results suggest that the unexplained 301 heritability could be hidden in epigenetics. For discovering the unexplained heritability of migraine. future studies focusing on the identification of heritable epigenetic marks for migraine can be highly 302 relevant. 303

304

305 CONCLUSION

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We found that rare variants (MAF<0.1%) in a Polycomb Response Element in the *ASTN2* locus associated with migraine. The association was independent of the original, common variant in the locus. Thus, migraine GWAS loci also contain independent rare risk variants. We propose a biological mechanism for migraine by which chromatin remodeling is disrupted by rare variants in Polycomb Response Elements.

312

313 ABBREVIATIONS

315	GWAS	Genome-Wide Association Study				
316	LD	Linkage disequilibrium				
317	MAF	Minor allele frequency				
318	PcG	Polycomb Group protein				
319	PRE	Polycomb Response Element				
320	TFBS	Transcription factor binding site				
321	UTR	Untranslated region				
322	WGS	Whole genome sequencing				
323						
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332	The authors h	ave declared that no competing interests exist.				
333						
334	DATA AVA	ILABILITY				
335						
336	The data supp	porting the conclusions of this article are unavailable, as they contain information that				
337	may be used	for identifying study participants. However, summary data supporting the conclusions				
338	of this article	are available on request to the corresponding author of this article.				

339

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341

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346

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