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Genome-wide genetic analyses highlight mitogen-activated protein kinase (MAPK) signaling in the pathogenesis of endometriosis

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STUDY QUESTION: Do genome-wide association study (GWAS) data for endometriosis provide insight into novel biological pathways associated with its pathogenesis?

SUMMARY ANSWER: GWAS analysis uncovered multiple pathways that are statistically enriched for genetic association signals, analysis of Stage A disease highlighted a novel variant in MAP3K4, while top pathways significantly associated with all endometriosis and Stage A disease included several mitogen-activated protein kinase (MAPK)-related pathways.

WHAT IS KNOWN ALREADY: Endometriosis is a complex disease with an estimated heritability of 50%. To date, GWAS revealed 10 genomic regions associated with endometriosis, explaining <4% of heritability, while half of the heritability is estimated to be due to common risk variants. Pathway analyses combine the evidence of single variants into gene-based measures, leveraging the aggregate effect of variants in genes and uncovering biological pathways involved in disease pathogenesis.

STUDY DESIGN, SIZE, DURATION: Pathway analysis was conducted utilizing the International Endogene Consortium GWAS data, comprising 3194 surgically confirmed endometriosis cases and 7060 controls of European ancestry with genotype data imputed up to 1000 Genomes Phase three reference panel. GWAS was performed for all endometriosis cases and for Stage A (revised American Fertility Society (rAFS) I/II, n = 1686) and B (rAFS III/IV, n = 1364) cases separately. The identified significant pathways were compared with pathways previously investigated in the literature through candidate association studies.

PARTICIPANTS/MATERIALS, SETTING, METHODS: The most comprehensive biological pathway databases, MSigDB (including BioCarta, KEGG, PID, SA, SIG, ST and GO) and PANTHER were utilized to test for enrichment of genetic variants associated with endometriosis. Statistical enrichment analysis was performed using the MAGENTA (Meta-Analysis Gene-set Enrichment of variaNT Associations) software

MAIN RESULTS AND THE ROLE OF CHANCE: The first genome-wide association analysis for Stage A endometriosis revealed a novel locus, rs 144240142 ($P = 6.45 \times 10^{-8}$, OR = 1.71, 95% CI = 1.23–2.37), an intronic single-nucleotide polymorphism (SNP) within

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MAP3K4. This SNP was not associated with Stage B disease (P = 0.086). MAP3K4 was also shown to be differentially expressed in eutopic endometrium between Stage A endometriosis cases and controls ($P = 3.8 \times 10^{-4}$), but not with Stage B disease (P = 0.26). A total of 14 pathways enriched with genetic endometriosis associations were identified (false discovery rate (FDR)-P < 0.05). The pathways associated with any endometriosis were Grb2-Sos provides linkage to MAPK signaling for integrins pathway ($P = 2.8 \times 10^{-5}$, FDR- $P = 3.0 \times 10^{-3}$), Wnt signaling (P = 0.026), FDR-P = 0.026) and P = 1.30 sinkage to MAPK signaling for integrins pathway ($P = 6.0 \times 10^{-4}$, FDR-P = 0.029); with Stage A endometriosis: extracellular signal-regulated kinase (ERK) $P = 1.0 \times 10^{-4}$, FDR- $P = 1.0 \times 10^{-4}$, FDR-P = 0.013) and P = 0.013 and P = 0.013

LARGE SCALE DATA: Not applicable.

LIMITATIONS, REASONS FOR CAUTION: The analysis is restricted to (i) variants in/near genes that can be assigned to pathways, excluding intergenic variants; (ii) the gene-based pathway definition as registered in the databases; (iii) women of European ancestry.

WIDER IMPLICATIONS OF THE FINDINGS: The top ranked pathways associated with overall and Stage A endometriosis in particular involve integrin-mediated *MAPK* activation and intracellular *ERK/MAPK* acting downstream in the *MAPK* cascade, both acting in the control of cell division, gene expression, cell movement and survival. Other top enriched pathways in Stage B disease include *ECM glycoprotein* pathways important for extracellular structure and biochemical support. The results highlight the need for increased efforts to understand the functional role of these pathways in endometriosis pathogenesis, including the investigation of the biological effects of the genetic variants on downstream molecular processes in tissue relevant to endometriosis. Additionally, our results offer further support for the hypothesis of at least partially distinct causal pathophysiology for minimal/mild (rAFS I/II) vs. moderate/severe (rAFS III/IV) endometriosis.

STUDY FUNDING/COMPETING INTEREST(S): The genome-wide association data and Wellcome Trust Case Control Consortium (WTCCC) were generated through funding from the Wellcome Trust (WT084766/Z/08/Z, 076113 and 085475) and the National Health and Medical Research Council (NHMRC) of Australia (241944, 339462, 389927, 389875, 389891, 389892, 389938, 443036, 442915, 442981, 496610, 496739, 552485 and 552498). N.R. was funded by a grant from the Medical Research Council UK (MR/K011480/1). A.P. M. is a Wellcome Trust Senior Fellow in Basic Biomedical Science (grant WT098017). All authors declare there are no conflicts of interest.

Key words: endometriosis / genetics / genome-wide association / pathway analysis / disease subtypes / MAPK signaling

Introduction

Endometriosis is a chronic inflammatory disease in which endometrial-like tissue is located outside the uterus. It is associated with debilitating pelvic pain and reduced fertility, and affects 1.5 M women in the UK (176 M worldwide) (Simoens et al., 2012). Treatments are limited to surgical removal of disease tissue, and hormonal drugs with many side effects. Identifying novel diagnostic tools and treatments requires a better understanding of the pathogenesis of endometriosis. Although advances have certainly been made in the past decade in understanding of biological processes likely to promote the maintenance and growth of lesions, the actual causes remain largely unclear. Previous investigations have considered the potential roles of steroids, endometrial aberrations, altered peritoneal environment, reduced immune surveillance and increased angiogenic capacity in the pathogenesis (Giudice and Kao, 2004) but, crucially, it is not known whether these processes are a necessary cause, or rather an effect of the disease process.

One method to improve understanding of complex disease causality is through the identification of genetic factors underlying disease risk, through genome-wide association studies (GWAS). The involvement of genetic factors in the development of endometriosis is supported by numerous studies (Simpson, et al., 1980; Bischoff and Simpson, 2004; Rahmioglu et al., 2015a, 2015b), and its heritability is estimated at ~50% (Treloar et al., 1999; Saha et al., 2015). Before the advent of GWAS, candidate gene association studies were the most common

type of study in the investigation of genetic factors underlying complex diseases, and many such studies have been published for endometriosis (Rahmioglu, et al., 2012; Montgomery et al., 2014). Results from candidate association studies have been poorly replicated for a number of reasons that are intrinsic to their design (Rahmioglu et al., 2015b). GWAS bypasses the weaknesses of candidate association studies as they are not based on an a priori biological hypothesis.

The GWAS for endometriosis conducted to date have identified 10 genome-wide significantly associated variants (Rahmioglu et al., 2014; Zondervan et al., 2016), in data sets including women of European and Japanese ancestry (Uno et al., 2010; Painter et al., 2011; Nyholt et al., 2012; Albertsen et al., 2013; Sapkota et al., 2015). Most of these show stronger association with moderate/severe disease, but together they explain <4% of heritability (Rahmioglu et al., 2014; Zondervan et al., 2016). Of the total variance in disease risk, 24% has been estimated to be due to common genetic variants (Lee et al., 2013). Larger GWAS meta-analyses are required to bring the field of endometriosis up to speed with progress made in other areas (e.g. breast cancer: 67 common genetic predisposing loci are now known, from meta-analysis of >55 000 cases; Michailidou et al., 2013); however, other approaches are also needed to identify remaining genetic variants and pathways.

One disadvantage of GWAS is the requirement for a very stringent genome-wide significance threshold ($P < 5 \times 10^{-8}$) to identify variants likely to be genuinely associated with a complex disease. Such a stringent threshold is necessary because of the large number of

statistical tests being conducted when testing each individual variant for association with the disease; however, it results in true associations not reaching this threshold being missed. One approach to uncover genetic variants associated with the disease under this multiple-testing burden is to aggregate genetic variants passing a predefined significance threshold for association with a disease into gene-based measures and to investigate whether the number of associated genes in a given pathway is greater than expected by chance (Perry et al., 2009).

We aimed to explore whether the largest GWAS data set to date comprising 3194 surgically confirmed endometriosis cases (Painter et al., 2011) can provide insight into novel biological pathways causally involved in endometriosis pathogenesis. We tested pathways, without any preselection, for evidence of enrichment of genetic variants associated with endometriosis. We also performed the first GWAS analysis for minimal/mild (Stage A) endometriosis. Lastly, we investigated to what extent pathways that have been investigated most frequently through candidate gene association studies feature in those highlighted in GWAS-based pathway analyses.

Materials and Methods

GWAS participants and phenotyping

The International Endogene Consortium (IEC) GWAS data included 3194 surgically confirmed endometriosis cases, and 7060 controls of European ancestry from Australia and the UK (Supplementary Table SI) (Painter et al., 2011). Cases were classified according to the revised American Fertility Society (rAFS) classification for endometriosis severity through assessment of surgical records and grouped into two sub-phenotypes: Stage A (rAFS Stage I or II, or some ovarian disease with a few adhesions: peritoneal or superficial ovarian disease with filmy adhesions, n = 1686) and Stage B (rAFS Stage III–IV: deep ovarian and/or rectovaginal disease with dense adhesions, n = 1364) (ASRM, 1985). Australian controls included 1870 parents and siblings of adolescent twins recruited as part of the Brisbane Adolescent Twin Study. The UK controls included 3000 individuals from the 1958 British Birth Cohort and 3000 from National Blood Service Donors, provided by the Wellcome Trust Case Control Consortium 2 (Wellcome Trust Case Control et al., 2007, 2010).

Genotyping and imputation

Cases were genotyped using the Illumina Human670Quad BeadArray, the Australian controls on Illumina Human610Quad and the UK controls on Illumina Human1M-Duo. The genotype data, including the autosomes and chromosome X, were imputed to the latest 1000 Genomes Phase three reference panel (October 2014). Pre-phasing and imputation were performed using SHAPEIT2 (Delaneau et al., 2014) and IMPUTE2 (Howie et al., 2009) softwares, respectively.

Genome-wide association and functional analyses

Three sets of genome-wide association analysis were performed: (i) All cases (n = 3194), (ii) Stage A cases (n = 1686) and (iii) Stage B cases (n = 1364) vs. controls (n = 7060) to see whether the two sub-phenotypes share similar underlying or have distinct underlying genetic factors in their causation. Logistic regression analysis including a covariate representing the Australian and the UK strata was performed in SNPTESTv2 (Marchini et al., 2007). After genome-wide association analysis, the results from biallelic single-nucleotide polymorphisms/(INsertion/DELetion) (SNPs/INDELs)

with imputation quality >0.8 and minor allele frequency (MAF) >0.01 were retained ($n=8\,943\,157$). QQ plots for all cases, Stage A and Stage B disease associations are provided in Supplementary Figure S1.

Genetic variants associated with overall, Stage A and Stage B disease $(P < 1 \times 10^{-6})$ were checked for functional evidence in the genomic region in the Encyclopedia of DNA Elements (ENCODE) consortium data (Consortium, 2012). Histone modification marks were identified from seven cell lines (GM12878, H1-hESC, HSMM, HUVEC, K562, NHEK, NHLF) and DNAse I hypersensitivity peaks identified from 95 cell types from ENCODE database using UCSC (University of California, Santa Cruz) genome browser annotation tools (endometrial tissue limited to four samples only).

The genes closest to the genetic variants associated with overall, Stage A and Stage B disease ($P < I \times 10^{-6}$) were tested for differential expression using a previously published, publicly available data set (GEO Accession: GSE51981) of eutopic endometrium from 77 endometriosis cases (Stage A n=27, Stage B n=48, unclassified n=2) and 71 endometriosis-free controls assayed using the Affymetrix Human Genome U133 Plus 2.0 Array (Tamaresis et al., 2014). Comparisons between groups to identify differentially expressed genes were conducted on original submitter-supplied processed data using GEOquery and limma R packages in GEO2R (Smyth, 2005; Davis and Meltzer, 2007). We performed differential expression analysis including all cases vs. controls from all menstrual phases, checked whether the most significant probes per gene region were differentially expressed between menstrual phases, and if so, conducted within-phase differential expression analysis between cases and controls.

Pathway analysis using GWAS results in MAGENTA

Pathway genetic enrichment analysis was performed for (i) all endometriosis, (ii) Stage A endometriosis, (iii) Stage B endometriosis GWAS results, using MAGENTA (Meta-Analysis Gene-set Enrichment of variaNT Associations) software (Segre et al., 2010) (Supplementary Figure S2). MAGENTA first maps SNPs to genes taking 110 Kb upstream and 40 Kb downstream of each gene as extended boundaries to include regulatory regions. Each gene is then assigned a genetic score (GS), which is the *P*-value of the most significant SNP within the gene's extended boundaries, corrected for six potential confounding factors of physical and genetic properties of genes through a step-wise multiple linear regression: (i) the physical size of the gene, (ii) number of SNPs per kilobase for each gene, (iii) estimated number of independent SNPs per gene, (iv) number of recombination hotspots spanning each gene, (v) genetic distance of the gene and (vi) linkage disequilibrium (LD) unit distance per gene.

We built a pathway database library from the two most comprehensive and up-to-date resources, Molecular Signatures database v5.1 (MSigDB) and PANTHER pathway database v10.0 (15 December 2015), and used this library in the pathway genetic enrichment analyses (Supplementary Figure S2). The Molecular Signatures Database (MSigDB) version 5.1 (Mootha et al., 2003; Subramanian et al., 2005) (http:// software.broadinstitute.org/gsea/msigdb/index.jsp) is the most extensive resource of gene sets/pathways, currently comprising 13311 nonindependent gene sets. From this database, we downloaded (i) the curated canonical pathways (C2-CP), which include 1330 gene sets amalgamated from BioCarta, Kyoto Encyclopedia of Genes and Genomes (KEGG), Matrisome, Pathway Interaction Database (PID), Reactome, SigmaAldrich (SA), Signaling Gateway (SIG), Signaling Transduction KE (ST) and SuperArray and (ii) Gene Ontology (GO) gene sets, which include 1454 gene sets comprised of biological processes, cellular components, molecular functions. We also downloaded 149 curated canonical pathways from the PANTHER database version 10.0 (Mi et al., 2016), which were not part of the MSigDB. The total number of pathways included was 2933, with the effective number tested n = 2860 (excluding pathways with <10 genes) (Supplementary Figure S2).

MAGENTA employs a Gene Set Enrichment Analysis (GSEA)-like statistic (Mootha et al., 2003; Subramanian et al., 2005) to the gene association P-values adjusted for confounding factors. The null hypothesis in the analysis is that the tested genes are randomly distributed in terms of significance (P-values) of association with the disease of interest, within each pathway. The alternative hypothesis assumes enrichment above a given rank cutoff compared with multiple random gene sets. The rank cutoff is a pre-determined gene P-value cutoff, and is defined as a given percentile of all gene P-values in the genome. We used a 95% cutoff threshold for significance. Multiple-testing correction was applied through calculation of the false discovery rate (FDR) for resources with >25 genesets/pathways. Results from smaller resources with <25 pathways, which were more likely to be independent of each other, were also adjusted using a Bonferroni correction (P = 0.05/number of pathways tested). The software was obtained from http://www.broadinstitute.org/mpg/magenta/ and ran locally in MATLAB R2013a.

Identification of pathways suggested by previously published candidate gene studies

The 122 candidate genes (Rahmioglu et al., 2012) that have been investigated for association with endometriosis were queried using the PANTHER 10.0 database on 15 December 2015, which contains pathway information on 20 000 genes within 149 curated human pathways. The genes were tested for over-representation in these pathways (Mi et al., 2016) by calculating the difference between the observed fraction of genes in that pathway and the number expected by chance, with significance of over-representation tested using a Fisher's exact test. The PANTHER pathways that showed statistically significant (P < 0.05 after Bonferroni multiple-testing correction) over-representation of the candidate genes were defined as the pathways that have been investigated indirectly through candidate gene association studies (Supplementary Figure S2).

Results

After imputation to the latest 1000 Genomes Phase three reference panel, no novel genome-wide significant associations with overall endometriosis (n = 3194) or Stage B (n = 1364) (Table I, Supplementary Figure S3) were observed; the well-established rs12700667 remained the strongest association (OR = 1.32, 95% CI 1.20–1.46; $P = 2.45 \times 10^{-9}$ with Stage B disease). The second genome-wide significant locus remained at FNI, though imputation altered the strongest associated SNP from the previously reported rs1250258 (Painter et al., 2011) to highly correlated ($r^2 = 0.96$) rs1250248 (OR = 0.81, 95% CI 0.74–0.88; $P = 3.48 \times 10^{-8}$). We found 11 loci (Table I) showing nominal association ($P < 1.0 \times 10^{-6}$), 3 of which were established endometriosis loci (WNT4, CDKN2BAS1, ID4) and 8 had not previously been reported. Of these eight loci, three were associated with all endometriosis (LAMC3, CAPN14 and DEFA1), and six with Stage B disease (NAALADL2, NR2C1, C14orf132, FOXP2, CDH20 and LAMC3).

Our first ever GWAS analysis for Stage A endometriosis (n=1686 cases) revealed a novel locus, rs144240142 ($P=6.45\times10^{-8}$, OR 1.71, 95%CI 1.23–2.37), an intronic SNP with MAF of 0.01, imputation info score >0.8, within the MAP3K4 gene (Table I, Fig. 1). In addition, four more loci were associated with Stage A disease with nominal significance ($P<1.0\times10^{-6}$): two INDELS within *CDC73* and *CSMD1*

genes, and two intergenic SNPs near *EMX2* and *ALCAM* genes (Table I).

For each of the loci, we explored potential functionality using ENCODE (the Encyclopedia Of DNA Elements) Project data (Consortium, 2012) (see Materials and Methods). These showed most endometriosis-associated SNPs to be located near elements of the genome that are designated to be regulatory in a variety of cell types (Table I). The cell lines in which the regulatory elements were found included GM12878 (lymphoblastoid cell line), H1-hESC (human embryonic stem cells), HSMM (human skeletal muscle myoblasts), HUVEC (human umbilical vein endothelial cells), K562 (immortalized cell line produced from a female patient with chronic myelogenous leukemia), NHEK (normal human epidermal keratinocytes) and NHLF (normal human lung fibroblasts) (Consortium, 2012). The strongest associated endometriosis locus, rs12700667 ($P = 2.45 \times 10^{-9}$), is located in known epigenetic regulators (histone modification marks H3K27ac, H3K4MeI and H3K4Me3), in/near transcription factor binding (TFB) sites for a number of genes, and near a microRNA (miR148a, 87.9 Kb away); the nearest gene is NFE2L3 (Nuclear Factor, Erythroid 2-Like 3), located 290.2 Kb away (Table I). MAP3K4 is transcribed in all seven cell lines (ENCODE RNA sequencing data) while rs144240142 is located near (±1 kb) TFB sites for EGR1, CEBPB, FOSLI and FOS.

We performed differential expression analysis for each of the genetic loci, using the largest publicly available eutopic endometrium microarray expression data set (Tamaresis et al., 2014) (see Materials and Methods). Differential expression between 77 cases vs. 71 controls was observed for ID4, NFE2L3, MAP3K4, CDC73, CSMD1, FN1, NR2C1 and C14orf132 (FDR-corrected P < 0.05). Of these, ID4, NFE2L3 and MAP3K4 were also differentially expressed between proliferative, early and mid secretory phases. Differential expression analysis within each phase for these loci showed that ID4 and MAP3K4 were significantly differentially expressed between cases and controls in the proliferative phase, while NFE2L3 was not differentially expressed between cases and controls in any phase. All the loci associated with Stage A disease in our GWAS (MAP3K4, CDC73, EMX2, ALCAM) were more strongly differentially expressed when the analysis of the expression data set was restricted to Stage I/II cases vs. controls (27 cases vs. 71 controls). For Stage B associated loci, FN1, NR2C1, C14orf132, NFE2L3, we similarly observed stronger evidence of differential expression when analysis was restricted to Stage III/IV cases vs. controls (48 cases vs. 71 controls) (Supplementary Table SII).

Table II shows the results of the pathways that were significantly over-represented ('enriched') in the GWAS results, after correction for multiple testing (number of pathways; FDR-P < 0.05 or Bonferroni-P < 0.05 (see Materials and Methods)). WNT signaling—a key pathway implicated in our previous GWAS and pathway analyses—was significantly associated with all endometriosis at FDR < 0.05 but not after stringent Bonferroni correction taking account of the number of pathways in the SA database (see Materials and Methods). The top pathways significantly associated with all and Stage A endometriosis were mitogen-activated protein kinases (MAPK)-related, and originated from the large REACTOME database (Table II). Grb2-Sos provides linkage to MAPK signaling for integrins (all endometriosis, enrichment $P = 2.8 \times 10^{-5}$, FDR- $P = 3.0 \times 10^{-3}$) is a pathway that includes 15 genes, involving integrin clustering by fibronectin stimulation, linked to extracellular signal-regulated kinase (ERK)2 MAPK signaling. The genes

Regulatory function from

Stage B P Stage B OR

Variant type

Nearest gene

MAP3K4 (0bp)

Table I Independent signals from overall, Stage A and Stage B GWAS results with $P < I \times I0^{-6}$.

Stage A P Stage A OR

Overall P Overall OR

Rsid (Chr:

AI/A2 (MAF)

rs144240142 (6:161503024)										(1) Transcribed on seven cell lines assayed by RNA-seq data, (2) Near TFB sites for EGR1, CEBPB, FOSL1, FOS (±1 Kb)
rs200922190 (1:193203491)	A/AAATTAT (0.22)	2.35 × 10 ⁻⁴	0.90 (0.84–0.97)	1.79 × 10 ⁻⁷	0.83 (0.75–0.91)	0.097	0.97 (0.88–1.07)	Intronic Insertion	CDC73 (0bp)	(1) Transcribed on seven cell lines assayed by RNA-seq data, (2) Near TFB sites for TCF7L2, SETDB1, FOXA1, KAP1, TFAP2A, TFAP2C, FOS, ELF1, FAM48A (±1 Kb). (3) Near histone modification mark H3K4Me1, H3K27Ac
8:2806920	G/ GAAAGAAAAG AAAAGAAAAG (0.17)	0.73	1.36 (0.43–4.30)	3.82×10^{-7}	0.79 (0.71–0.88)	0.14	0.94 (0.84–1.05)	Intronic deletion	CSMD1 (0bp)	(1) Near histone modification mark H3K4Me1, (2) Near TFB sites for MAX, FOXP2, REST.
rs855965 (10:119443759)	G/A (0.34)	1.23×10^{-3}	0.89 (0.84–0.95)	4.10×10^{-7}	0.81 (0.74–0.88)	0.96	1.00 (0.92–1.09)	Intergenic SNP	EMX2 (I 34 702bp)	(I) Near histone modification mark H3K4Me I, (2) Near TFB sites for STAT3, CTCF, RAD2 I, SMC3, ESR I
rs113850637 (3:103850400)	C/T (0.16)	4.56 × 10 ⁻⁴	1.15 (1.06–1.25)	8.08 × 10 ⁻⁷	1.28 (1.16–1.41)	0.60	1.01 (0.90–1.13)	Intergenic SNP	ALCAM (I 235 853bp)	(1) Near a microRNA, mir548a3 (53076), (2) Near histone modification mark H3K4Me1, (3) Near TFB sites for EP300, GATA2, JUN, FOS, MAX, USF1, YY1, CTCF, TCF12, POU5F1
Stage B endometriosi: rs12700667 (7:25901639)	s GWAS G/A (0.25)	5.57 × 10 ⁻⁷	1.17 (1.09–1.25)	0.038	1.07 (0.98–1.16)	2.45×10^{-9}	1.32 (1.20–1.46)	Intergenic SNP	NFE2L3 (290 221bp)	(1) Near a microRNA, mir148a (87900 bp), (2) In histone modification marks H3K27AC, H3K4Me1, H3K4Me3, (3) In/near TFB sites for MXII, POLR2A, TBP, NFYA, ARID3A, GATA3, ELFI, TEAD4, JUND, SMARCA4, SIX5, MAX, NRFI, RFX5, CHD2, CREBI, CEBPC, ATFI, KDM5B, JUN, NFYB, RUNX3, SP4, MAZ, SIN3A, ZBTB7A, MYC, STAT3, HMGN3, CCNT2, CBX3,
										Continued

Table	Continued

Rsid (Chr: Position)	AI/A2 (MAF)	Overall P	Overall OR (95% CI)	Stage A P	Stage A OR (95% CI)	Stage B P	Stage B OR (95% CI)	Variant type	Nearest gene (distance)	Regulatory function from ENCODE (±25 Kb)*
										TCF3, BHLHE40, EP300, E2F6, FOXP2, GABPA, ZNF143, SPII, USFI, EGRI, E2F4, E2FI, MAFK, TCF7L2, POU2F2, TAFI, PHF8, IRFI, FOXAI (±1 Kb)
rs517875 (3:174350886)	C/A (0.42)	5.56×10^{-4}	1.09 (1.03–1.16)	0.35	1.01 (0.93–1.09)	1.06×10^{-7}	1.23 (1.13–1.33)	Intronic SNP	NAALADL2 (0bp)	(I) Near TFB sites for MAFK, ESR I
rs7041895 (9:22162794)	A/C (0.43)	4.81×10^{-4}	1.12 (1.05–1.18)	0.60	1.02 (0.95–1.10)	1.06×10^{-7}	1.26 (1.16–1.37)	Intergenic SNP	CDKN2BASI (41 701bp)	Near histone modification mark H3K4Me1
rs1250258 (2:216300185)	C/T (0.27)	2.48×10^{-5}	0.89 (0.83–0.95)	0.22	0.98 (0.90–1.07)	3.48×10^{-8}	0.81 (0.74–0.88)	Intronic SNP	FNI (0bp)	(1) In histone modification mark H3K4Me3, H3K27Ac. (2) In/near TFB sites for POLR2A, TEAD4, TAF1, MBD4, MXI1, RBBP5, SIN3A, FOXA2, MAX, EZH2, RCOR1, MYC
12:95403979 (12:95403979)	C/CT (0.11)	3.35×10^{-6}	1.24 (1.13–1.36)	0.13	1.11 (0.98–1.24)	2.43×10^{-7}	1.38 (1.23–1.56)	Intergenic SNP	NR2CI (12 026bp)	(I) Near TFB sites for TRIM28, CBX3, USFI, CTCF
rs71415016 (14:96443958)	T/C (0.08)	1.16×10^{-4}	1.19 (1.06–1.32)	0.16	1.03 (0.89–1.19)	3.00×10^{-7}	1.38 (1.20–1.59)	Intergenic SNP	C14orf132 (61 880bp)	Near histone modification mark H3K4Me1
rs62469231 (7:114031174)	G/A (0.02)	1.10×10^{-5}	1.44 (1.18–1.77)	0.018	1.23 (0.94–1.60)	4.95×10^{-7}	1.77 (1.37–2.27)	Intronic SNP	FOXP2 (0bp)	Near histone modification mark H3K4Me1
rs3920498 (1:22492887)	G/C (0.20)	1.10×10^{-5}	1.19 (1.11–1.28)	0.034	1.11 (1.02–1.22)	6.49×10^{-7}	1.30 (1.18–1.43)	Intergenic SNP	WNT4 (22 502bp)	(1) In histone modification mark H3K4Me1, (2) In/near TFB sites for RELA, pouf2f2, ebf1 (±1 Kb).
rs6908034 (6:19773930)	G/A (0.16)			0.012	1.13 (1.02–1.25)	7.31×10^{-7}	1.30 (1.17–1.45)	Intronic SNP	ID4 (64 056bp)	Located in an anti-sense RNA, RPI-167F1.2
rs12455952 (18:58840518)	T/G (0.19)	1.75×10^{-5}	1.16 (1.07–1.25)	0.021	1.09 (0.99–1.20)	9.59×10^{-7}	1.27 (1.15–1.40)	Intergenic SNP	CDH20 (317 287bp)	Near TFB sites for MAFK, E2F4, FOS
rs138913144 (9:133897939)	A/ATATT (0.07)			4.47×10^{-3}	0.86 (0.74–1.00)	9.94 × 10 ⁻⁷	0.68 (0.57–0.81)	Intronic insertion	LAMC3 (0bp)	(1) Near a small nucleolar RNA, SNORA31 (1246bp), (2) Near histone modification mark H3K4Me1

TFB sites, transcription factor binding sites; rsid, SNP ID; Chr, chromosome; MAF, minor allele frequency; P, Association test P-value, OR, odds ratio; SNP, single-nucleotide polymorphism; GWAS, genome-wide association study.

*Histone modification marks as identified from seven cell lines (GM12878, H1-hESC, HSMM, HUVEC, K562, NHEK, NHLF) from ENCODE database and DNAse I hypersensitivity peaks identified from 95 cell types from ENCODE database using UCSC genome browser annotation tools.

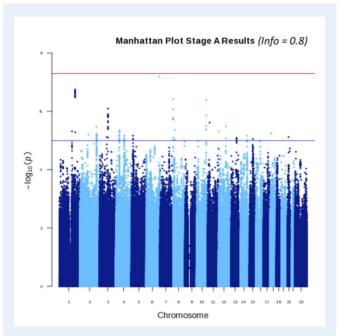


Figure 1 Manhattan plot of association of single-nucleotide polymorphisms (SNPs) with Stage A endometriosis in the GWAS. Red horizontal line marks the genome-wide significance ($P < 5 \times 10^{-8}$), and blue line marks nominal significance ($P < 5 \times 10^{-6}$).

enriched for association with endometriosis (P < 0.05) in this pathway were (i) FNI (fibronectin I, $P = 9.75 \times 10^{-4}$); (ii) FGA (fibrinogen alpha chain, $P = 1.95 \times 10^{-3}$); (iii) FGB (fibrinogen beta chain; $P = 3.95 \times 10^{-3}$); (iv) FGG (fibrinogen gamma chain; $P = 1.95 \times 10^{-3}$); (v) RAPIB (Rasrelated protein Rap-Ib; $P = 9.67 \times 10^{-3}$) and (vi) SOSI (Son of sevenless homolog I; $P = 7.50 \times 10^{-4}$). The second MAPK-related pathway significantly enriched for association with all endometriosis ($P = 6.0 \times 10^{-4}$, FDR-P = 0.029; Table II) was PI30Cas linkage to MAPK signaling for integrins, a Reactome pathway also including I5 genes. This pathway signifies the role of p130Cas in survival signals and cell motility from the extracellular matrix (ECM) through integrin, activating the ERKI ERK2 MAPK pathway. The two MAPK-related pathways define similar functions as they overlap by I2 genes (Fig. 2). Indeed, the top endometriosis-associated genes—shared by both pathways—were FNI, FGA, FGB, FGG and RAPIB.

For Stage A endometriosis, the top pathway enriched in the GWAS results was the *ERK1 ERK2 MAPK pathway* from the Signal Transduction (ST) database ($P = 5.0 \times 10^{-4}$, FDR- $P = 5.0 \times 10^{-4}$, Bonferroni-P = 0.011). The top associated genes in this pathway were *TRAF3* (TNF Receptor-Associated factor 3; $P = 2.1 \times 10^{-4}$); *MAP2K1* (Mitogen-Activated Protein Kinase Kinase I; $P = 5.7 \times 10^{-3}$); *SOS1*; (P = 0.019); *SHC1* (Src Homology two Domain Containing Transforming Protein I; P = 0.027); *CREB5* (CAMP Responsive Element Binding Protein 5; P = 0.022); *NFKB1* (Nuclear factor of Kappa Light Polypeptide Gene Enhancer in B-cells I; P = 0.025); and *BRAF* (B-Raf Proto-Oncogene, Serine/Threonine Kinase; P = 0.032). The *ERK1 ERK2 MAPK pathway* overlaps with P130Cas linkage to MAPK signaling for integrins pathway by two genes: *GRB2* and *SOS1* (Fig. 2).

The MAP3K4 gene, in which we had observed SNP rs144240142 to be associated with Stage A endometriosis, is part of two pathways

arising from the ST database: the p38 MAPK pathway and the c-Jun amino-terminal protein kinase (JNK) MAPK pathway. The p38 MAPK pathway overlaps with the ERK1 ERK2 MAPK pathway by 10 genes (ATF1, CREB1, CREB3, CREB5, EEF2K, EIF4E, MAPK1, MKNK1, MKNK2, NFKB1), while the JNK MAPK pathway overlaps by two genes (DUSP4, SHC1) (Fig. 2).

Other pathways significantly enriched (FDR-P and Bonferroni-P < 0.05) in GWAS results for Stage A endometriosis were (Table II) TRKA receptor (SA) and PIP3 signaling in cardiac myocytes (SIG). G alpha S pathway (ST), Phosphoinositide three kinase pathway (ST), Differentiation pathway in PC12 cells (ST), B cell receptor complexes (SA), Insulin receptor pathway in cardiac myocytes (SIG) and PTEN pathway (SA) were significant at FDR < 0.05 but not after stringent Bonferroni correction (see Materials and Methods).

For Stage B analysis, two pathways were significantly enriched (FDR-P and Bonferroni-P < 0.05): ECM glycoproteins (P = 1.8×10^{-3} , FDR-P = 7.1×10^{-3} , Bonferroni-P = 0.018) including 196 genes defined by Matrisome Project gene sets (http://web.mit.edu/hyneslab/matrisome/) (Naba et al., 2012), and Core matrisome comprising 275 genes encoding all known ECM glycoproteins, collagens and proteoglycans (P = 1.4×10^{-3} , FDR-P = 0.013, Bonferroni-P = 0.014). The ECM glycoproteins gene set is a subset of the Core Matrisome and thus many of the genes enriched in the endometriosis GWAS overlap. Notably, this includes FNI, FGG and FGA, which are also part of the Reactome MAPK-related pathways associated with all endometriosis (Fig. 2).

Lastly, we set out to investigate to what extent pathways investigated previously in hypothesis-based candidate gene studies were highlighted by the hypothesis-free GWAS analyses. Among the 122 candidate genes investigated previously (see Materials and Methods), there was significant over-representation of investigation of 16 pathways (Table III), the top three being: Interleukin signaling pathway $(P = 2.3 \times 10^{-12})$, Apoptosis signaling pathway $(P = 9.7 \times 10^{-9})$ and Gonadotropin releasing hormone receptor pathway ($P = 1.2 \times 10^{-6}$). Others covered inflammation-related pathways, cellular homeostatic signaling, thrombolysis, angiogenesis and steroid biosynthesis. Only 2/122 genes were part of a pathway that was highlighted by our GWAS pathway analysis: NFKB1 in ERK1 ERK2 MAPK pathway and CDKN1B in PIP3 signaling in cardiac myocytes (Table III). The results showed that of the pathways enriched in GWAS analyses only Insulin/ IGF pathway with MAPK cascade and PI3 kinase pathway featured in the pathways explored in hypothesis-driven candidate gene association studies conducted to date, but others did not.

Discussion

We have presented the first comprehensive analysis investigating biological pathways underlying endometriosis pathogenesis using genomewide methodology. This analysis was based on GWAS results from all endometriosis cases, Stage A and Stage B cases vs. controls. Because the pathway results are based on genetic data, they provide strong evidence of causal involvement of these pathways in disease development and/or maintenance. In addition, we presented the first GWAS analysis for Stage A disease, further exploring the hypothesis of distinct causal pathophysiology on endometriosis subtypes.

The results confirm earlier reports that Stage A vs. Stage B have distinct genetic contributors (Painter et al., 2011; Nyholt et al., 2012;

Table II Genome-wide pathway analysis of all, Stage A and Stage B endometriosis results identified in MAGENTA.

Database (#pathways)	Pathway	Geneset size	P-value	FDR <i>P</i> -value	Bonferroni <i>P</i> -value*	Expected N genes	Observed N genes
Overall endometriosis	5						
REACTOME (671)	Grb2-Sos provides linkage to MAPK signaling for integrins	15	2.8×10^{-5}	3 × 10 ⁻³	NA	I	6 (FN1, FGG, FGA, FGB, RAP1B, SOS1)
SA (9)	Wnt signaling	89	0.026	0.026	0.24	4	9 (WNT4, CTNNBIP1, RHOU, PPP2R1A, CTBP2, HPRT1, CXXC4, SFRP1, KREMEN1)
REACTOME (671)	p I 30CAS linkage to MAPK signaling for integrins	15	6 × 10 ⁻⁴	0.029	NA	1	5 (FN1, FGG, FGA, FGB, RAP1B)
Stage A endometriosi	is						
ST (23)	ERK1 ERK2 MAPK pathway	32	5×10^{-4}	5×10^{-4}	0.011	2	7 (TRAF3, MAP2K1, SOS1, CREB5, NFKB1, SHC1, BRAF)
SA (9)	TRKA receptor	17	1×10^{-3}	2.5×10^{-3}	9.0×10^{-3}	I	5 (ELKI, MAP2KI, SOSI, NTRKI, SHCI)
SIG (8)	PIP3 signaling in cardiac myocytes	67	1.6×10^{-3}	4.5×10^{-3}	0.013	3	10 (RPS6KB1, PTK2, YWHAG, PAK7, SOS1, CREB5, SHC1, CDKN1B, IGFBP1, GSK3B)
ST (23)	G alpha S pathway	16	5.5×10^{-3}	8.8×10^{-3}	0.13	I	4 (RASGRF2, CREB5, BRAF, SNX13)
ST (23)	Phosphoinositide three kinase pathway	37	9.1×10^{-3}	9.1×10^{-3}	0.21	2	6 (RPS6KB1, YWHAG, SOS1, SHC1, IGFBP1, GSK3B)
ST (23)	Differentiation pathway in PC12 cells	45	5.5×10^{-3}	0.019	0.13	2	7 (CREBBP, ELKI, RASGRF2, CREB5, NTRKI, SHCI, BRAF)
SA (9)	B cell receptor complexes	24	0.026	0.026	0.24	I	4 (ELKI, MAP2KI, SOSI, SHCI)
SIG (8)	Insulin receptor pathway in cardiac myocytes	51	0.033	0.033	0.26	2	6 (RPS6KB1, YWHAG, SOS1, SHC1, IGFBP1, GSK3B)
SA (9)	PTEN pathway	17	0.051	0.042	0.46	1	3 (SOS1, IPCEF1, SHC1)
Stage B endometriosis							
NABA (10)	ECM glycoproteins	196	1.8×10^{-3}	7.1×10^{-3}	0.018	9	19 (FN1, LAMC3, THBS1, TNFAIP6, RSPO3, FBLN2, SPARC, VWF, GLDN, LAMB3, MXRA5, FGG, FGA, EMILIN2, TSPEAR, ZPLD1, EDIL3, WISP3, IGFBP6)
NABA (10)	CORE Matrisome	275	1.4×10^{-3}	0.013	0.014	13	24 (FN1, LAMC3, THBS1, HSPG2, TNFAIP6, RSPO3, FBLN2, SPARC, SPOCK3, VWF, COL12A1, GLDN, LAMB3, MXRA5, DCN, LUM, FGG, FGA, EMILIN2, TSPEAR, ZPLD1, HAPLN4, KERA, EDIL3)

^{*}For databases with <25 pathways, we computed the Bonferroni *P*-value adjusted for the number of pathways within the given database resource, in addition to the FDR multipletesting correction computed by the MAGENTA software (see Materials and Methods). Note that the Bonferroni adjustment is likely to be conservative given that the pathways within a resource are never fully independent of each other. Databases; SigmaAldrich (SA), Signaling Gateway (SIG), Signaling Transduction KE (ST), Matrisome Project gene sets (http://web.mit.edu/hyneslab/matrisome/) (Naba et al., 2012) (NABA).

Rahmioglu et al., 2014), and highlight for the first time the role of MAPK signaling in its pathogenesis. The GWAS analysis of Stage A disease resulted in a novel associated variant, rs 144240142, in an intronic region of MAP3K4, a gene that was also differentially expressed in endometrium from endometriosis cases and controls in our analysis of an independent data set (Tamaresis et al., 2014). This result is intriguing though it requires genotyping and replication in an independent data set. MAP3K4 encodes for the protein MAPKKK4, which is part of the p38 and JNK MAPK pathways. Subsequent pathway analysis

revealed *ERK1 ERK2 MAPK* as the most significant pathway associated with Stage A endometriosis.

The pathway analysis for all cases of endometriosis revealed two pathways that were also linked to MAPK signaling: *Grb2-Sos provides linkage to MAPK signaling for Integrins* and *p130Cas linkage to MAPK signaling for integrins*. These pathways largely overlap (12 out of the 15 genes in each are the same), and reflect different routes through which integrins (adhesion molecules) can activate *ERK1 ERK2 MAPK* signaling. *Wnt signaling* was also implicated in all endometriosis, in line with

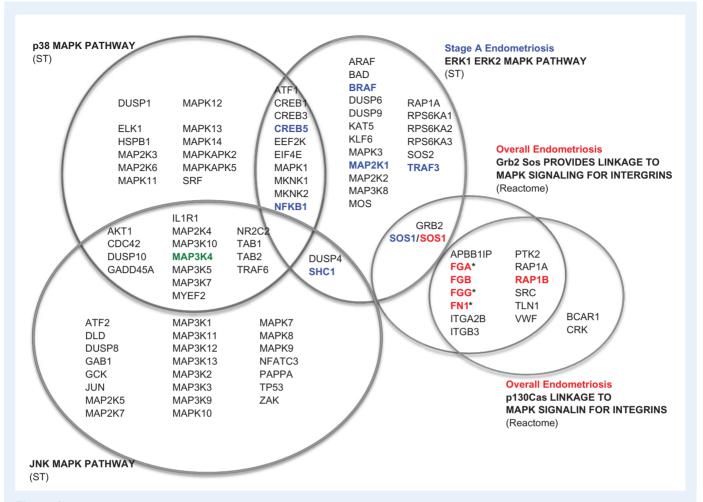


Figure 2 Mitogen-activated protein kinase (MAPK)-related pathways enriched for genome-wide association study (GWAS) associations with endometriosis. Genes for which association contributing most to the enrichment (P < 0.05) are highlighted in bold. *Genes taking part in ECM glycoproteins and CORE matrisome pathways (NABA).

previous reports of both single-SNP and pathway associations involving Wnt pathway genes (Painter et al., 2011; Nyholt et al., 2012; Sanchez et al., 2014; Rahmioglu et al., 2015a, 2015b), although the association was non-significant after stringent Bonferroni multipletesting correction.

MAPKs comprise a kinase enzyme family that add phosphate groups to other proteins to activate, triggering a cascade of downstream signaling reactions that are involved in many physiological processes, such as gene expression, mitosis, cell movement, metabolism, cell survival and apoptosis. The protein kinase cascade consists of enzyme components; MAPK kinase kinase (MAPKKK), MAPK kinase (MAPKK) and MAP kinase (MAPK), that are activated consecutively (Fig. 3). Extracellular stimuli activate the Grb2-Sos complex, which then promotes Ras protein activation and which in turn activate the cytosolic MAPK pathway that finally leads to intranuclear events and cellular responses. Three main MAPK classes are distinguished by their biological function: ERKs acting in the control of cell division; JNKs regulating transcription; and p38 MAPK playing important roles in immune response, cell survival and differentiation regulation. They are mostly activated by inflammatory cytokines and environmental stresses, while other stimuli include growth factors, neurotransmitters, steroid

hormones, osmolarity and cell adherence (Widmann et al., 1999; Johnson and Lapadat, 2002).

A role for MAPK pathways has been recognized in a wide range of diseases, including cancers (Lei et al., 2014), obesity-associated insulin resistance (Hirosumi et al., 2002), ischemic heart disease (Bogoyevitch et al., 2004) and autoimmune diseases (Genovese, 2009). In endometriosis, MAPK signaling has been implicated previously, based on observed differential expression profiles and induction of cell proliferation in ectopic vs. eutopic endometrial cells in women with endometriosis vs. controls (Yotova et al., 2011; Li et al., 2013; Wu, et al., 2014). Gene expression within the ERK MAPK pathway has been suggested to be dysregulated in eutopic endometrium after experimental endometriosis induction in a baboon model (Afshar et al., 2013). However, these studies were unable to indicate whether these processes were causative to, or resulting from, the disease. Our results show that the association between MAPK signaling and endometriosis has a genetic basis and therefore likely reflects a causal mechanism, and furthermore, suggest that this association is limited to Stage A

An intriguing mechanism through which MAPK signaling could be associated with Stage A endometriosis is through a role in increased

Table III Most frequently investigated biological pathways for endometriosis through candidate gene studies, as defined by PANTHER database (July 2014)

PANTHER: Biological pathway	Candidate genes ^a
Interleukin signaling pathway ($n = 95$)	13 ($P = 2.3 \times 10^{-12}$)
Apoptosis signaling pathway ($n = 113$)	$II(P = 9.7 \times 10^{-9})$
Gonadotropin releasing hormone receptor pathway ($n = 228$)	$12 (P = 1.2 \times 10^{-6})$
Inflammation mediated by chemokine/cytokine signaling ($n = 233$)	$12 (P = 1.6 \times 10^{-6})$
p53 pathway (n = 81)	$8 (P = 3.9 \times 10^{-6})$
Plasminogen activating cascade $(n = 17)$	$5 (P = 9.4 \times 10^{-6})$
Insulin/IGF pathway-protein kinase B signaling cascade ($n = 37$)	$6 (P = 1.4 \times 10^{-5})$
p53 pathway feedback loops 2 ($n = 47$)	$5 (P = 1.3 \times 10^{-3})$
VEGF signaling pathway ($n = 58$)	$5 (P = 3.6 \times 10^{-3})$
Angiogenesis ($n = 152$)	$7 (P = 4.5 \times 10^{-3})$
Androgen/estrogene/progesterone biosynthesis ($n = 10$)	$3 (P = 4.7 \times 10^{-3})$
Insulin/IGF pathway-mitogen-activated protein kinase kinase/MAP kinase cascade ($n = 32$)	$4 (P = 6.1 \times 10^{-3})$
Alzheimer disease-presenilin pathway ($n = 109$)	$6 (P = 6.5 \times 10^{-3})$
EGF receptor signaling pathway ($n = 123$)	6 (P = 0.013)
PI3 kinase pathway ($n = 47$)	4 (<i>P</i> = 0.027)

^aOut of the 122 candidate genes 65 do not participate in any of the PANTHER pathways.

sensitivity to pain, as MAPK pathways are differentially activated in neurons and glia in inflammatory pain and neuropathic pain conditions (Ji et al., 2009). A proportion of women with endometriosis have a neuropathic component involved in their pain mechanism (Whitaker et al., 2016). Interestingly, an animal model of endometriosis has shown p38 MAPK activation to play a role in this mechanism (Chen et al., 2015). Chronic pain patients appear less able to engage nociceptive pain processing and to produce endogenous pain inhibition (Tracey and Mantyh, 2007) and recent work suggests that dysfunction within this system may predispose an individual to develop chronic pain after an acute insult (De Felice et al., 2011). Thus, it may be that MAPK signaling is not associated with the presence of endometriosis per se, but with the experience of pain in women with Stage A disease, thereby increasing the likelihood of investigation and thus diagnosis. Our results show that associated variant rs144240142 resides in MAP3K4, part of the JNK and p38 MAPK classes, which overlap with the ERK1 ERK2 MAPK pathway that is genetically associated with Stage A disease. The implicated MAPK pathways act on the MAP kinase component level, more downstream in the cascade, close to the cell nucleus (Fig. 3). As these MAPK classes are functionally connected, they require a comprehensive functional investigation in relation to endometriosis.

The most significant pathways associated with Stage B (rAFS III/IV) disease were related to ECM and adhesion processes: the *Core Matrisome*, a large pathway containing 275 genes encoding all known ECM glycoproteins, collagens and proteoglycans that includes a subpathway, *ECM glycoproteins* containing 196 genes. Notably, the top genes associated with Stage B endometriosis in these pathways include *FN1*, *FGG* and *FGA* which are also part of the Reactome *integrin linkage to MAPK* pathways associated with all endometriosis. These pathways act on the MAPKKK component level, upstream in the cascade close to cellular membrane (Fig. 3). GWAS and replication analyses have

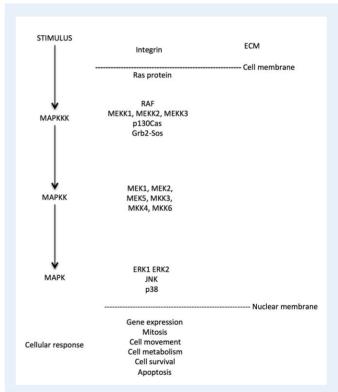


Figure 3 MAPK cascade and pathway components in mammalian cells. Adapted from Cabodi et *al.* (2010) and Zhang and Liu (2002).

shown that the association between genetic variants in FNI, encoding for fibronectin, and endometriosis is limited to Stage B disease (Pagliardini et al., 2013; Rahmioglu et al., 2014). Our pathway results

confirm a key role of ECM glycoprotein biology limited to Stage B disease. This observation is interesting, because it is the pathological accumulation of ECM proteins that defines fibrosis—a common hall-mark in Stage B (rAFS III/IV) disease.

The role of integrins and the ECM in endometriosis has long been postulated (Klemmt et al., 2007; Pitsos and Kanakas, 2009). Integrins are transmembrane adhesion receptors and construct bridges for cellcell and cell-ECM interactions. Studies have shown that integrin expression, particularly on peritoneal mesothelial cells, indicates a potential attachment site for ectopic endometrial cells (Witz et al., 2000), while integrins present in endometriosis lesions have been shown to be of peritoneal origin (Hull et al., 2008). Aberrations in ECM have been documented in relation to endometriosis, but it is not clear whether the mesothelial layer is damaged thus exposing the ECM, or whether inherent changes in the ECM promote the adherence of primary endometrial cells. Our findings suggest the latter.

GWAS analysis is a powerful tool in uncovering associations between common genetic variants and complex diseases such as endometriosis (Manolio et al., 2009), but requires large sample sizes to enable detection of associated variants at 'genome-wide significance' $(P < 5 \times 10^{-8})$. For instance, for breast cancer the largest GWAS meta-analysis has included >55 000 cases to date, finding 67 GWAS variants together explaining 14% of heritability (Michailidou et al., 2013). Case numbers for endometriosis discovery GWAS have been <1/10 the size, and have discovered only eight variants that explain <4% of heritability (Rahmioglu et al., 2014). Pathway analysis provides a powerful approach to leverage GWAS variant data in their cumulative effects into genes and pathways, thus substantially reducing the statistical impact of multiple testing and superseding the agnostic approach by highlighting functional pathways involved in pathogenesis. Increased sample sizes for endometriosis GWAS analysis are needed to identify further genetic variants associated with disease pathology that will also add to the analysis power and robustness of the pathways identified for endometriosis.

Drawbacks of pathway analysis are (i) only variants in or near genes are assigned to genes so that a large proportion of GWAS evidence pertaining to intergenic variants is disregarded; (ii) reliance on the contents of pathway databases and on the available software tools within them. Better studied biological processes are more likely to be defined into (more detailed) pathways than less well-studied ones. In our analysis, this may have resulted in the relatively greater detail of the different MAPK pathways highlighted. Our results summarizing candidate gene studies conducted to date showed that these have largely focused on pathways that do not feature in our genome-wide results. This does not mean that these candidate-based pathways are irrelevant to endometriosis causation, but rather that more consideration should be given to MAPK regulated ECM and integrin involving processes and Wnt signaling as relatively under-investigated pathways, in terms of biological follow-up.

An important method for understanding the effects of variants on downstream molecular processes is their integration with transcriptomic and epigenomic data. However, such functional studies need to be conducted in disease-related tissues, such as endometrium for endometriosis. There are no genome-wide data sets available currently that associate genetic variants with gene expression levels (expression quantitative trait loci) in endometrium. Currently, none of the large-scale genomic profiling initiatives such as GTex (Consortium,

2013) and the NIHR Epigenome Roadmap (Skipper et al., 2015) include endometrium, and very limited endometrium annotation data are available in ENCODE (Consortium, 2012). The lack of genomic annotation data currently severely impedes the 'translation' of genetic signals associated with endometriosis into their downstream effects.

MAPK, and Wnt signaling, pathways have been targeted for drug discovery, mainly in the area of cancer (Sebolt-Leopold and Herrera, 2004), but the ubiquitous functional nature of these pathways represents considerable challenges for a non-malignant condition such as endometriosis. Protein kinase inhibitors targeting the ERK1 ERK2 pathway were observed to control deep infiltrating endometriosis progression (Ngo et al., 2010) and their role in endometriosis treatment has been explored in several studies (Santulli et al., 2015). To date, they present unacceptable adverse effects, including ovulation inhibition and teratogenicity, skin and gastrointestinal toxicities, weight loss, fatigue, hypertension and infections (Krajewska et al., 2015). Targeting the Wnt signaling pathway has similar challenges (Duchartre et al., 2016). This does not negate the potential for more specific targets to be identified in these pathways that limit unwanted consequences, or topical rather than systemic applications to be developed. More studies are needed in this area.

Our results offer further support for the hypothesis of at least partially distinct causal pathophysiology for minimal/mild (rAFS I/II) vs. moderate/severe (rAFS III/IV) endometriosis. Based on our results, we postulate that integrin-mediated MAPK activation plays a key causal role in the establishment of endometriotic lesions. Development of Stage I/II disease is further characterized by involvement of the intracellular *ERK1 ERK2 pathway* acting downstream in the MAP kinase cascade, whereas Stage III/IV disease is characterized by other extracellular processes leading to increased fibrogenesis.

Supplementary data

Supplementary data are available at Human Reproduction online.

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Authors' roles

O.U. and N.R. are the lead authors. K.T.Z. developed the idea for the study and proposed the hypothesis. O.U., N.R. and K.T.Z. conceived and designed the study. K.T.Z. and G.W.M. obtained funding. N.R., D.R.N., G.W.M. and K.T.Z. provided study materials and collected and collated data. O.U., N.R. and A.P.M. did the statistical analysis. O. U., N.R. and K.T.Z. analyzed and interpreted the data. O.U. and N.R. made initial drafts of Tables and figures, and drafted the manuscript. D.R.N., K.V., S.A.M., C.B., A.P.M. and G.W.M. critically revised the manuscript for important intellectual content. All authors read and approved the final version of the manuscript. K.T.Z. is the study guarantor.

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Conflict of interest

All authors declare there are no conflicts of interest.

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