## RESEARCH



# The correlation between immune cells and endometriosis: a bidirectional twosample mendelian randomization study



Lele Pan<sup>1,2†</sup>, Yuying Chen<sup>1†</sup>, Ziwei Zhou<sup>1†</sup>, Song Ma<sup>1</sup>, Yuzhen Cao<sup>1</sup> and Ying Ma<sup>1\*</sup>

### Abstract

**Objectives** Endometriosis (EM), a prevalent estrogen-dependent inflammatory disorder affecting women of reproductive age, is characterized by the presence of endometrial-like tissue outside the uterus, resulting in pelvic scarring, pain, and infertility. Although the pathogenesis of EM remains poorly understood, there is growing evidence suggesting the involvement of the immune system in its etiology, pathophysiology, and associated morbidities such as pain, infertility, and adverse pregnancy outcomes. While previous studies have indicated a close relationship between the immune system and EM, the specific underlying mechanism remains incompletely elucidated.

**Methods** Through the utilization of publicly available genetic data, a two-sample Mendelian randomization (MR) analysis was conducted to establish an association between 731 immune cell phenotypes and EM. Comprehensive sensitivity analyses were performed to validate the robustness, heterogeneity, and potential horizontal pleiotropy of the findings.

**Results** The MR analysis revealed potential associations between 22 immune cell phenotypes and EM. Conversely, reverse MR analysis identified 11 immune phenotypes demonstrating potential associations between genetic liability in the immune phenotypes and EM.

**Conclusion** This study provides evidence of a potential correlation between immune cell phenotypes and EM, including the existence of reverse causation. These findings open up new avenues for investigating the underlying mechanisms of EM.

**Keywords** Endometriosis, Mendelian randomization, Immune cell traits, GWAS, Bidirectional mendelian randomization analysis, Two-sample mendelian randomization

 $^{\dagger}\text{Lele}$  Pan, Yuying Chen and Ziwei Zhou contributed equally to this work.

\*Correspondence: Ying Ma mayingwuzhuoyi@126.com <sup>1</sup>Obstetrics and Gynecology Medical Center, Zhujiang Hospital, Southern

Medical University, Guangzhou, China

<sup>2</sup>Department of Obstetrics and Gynecology, Guangdong Women and Children Hospital, Guangzhou, China

Children Hospital, Guangzhou, China



© The Author(s) 2024. **Open Access** This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if you modified the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by-nc-nd/4.0/.

#### Introduction

Endometriosis (EM) is a prevalent gynecological disorder characterized by the presence of endometrial-like tissue outside the uterine cavity, affecting approximately 10% of reproductive-aged women (190 million) worldwide [1]. The most commonly affected organs are located within the pelvic cavity, including the ovaries, fallopian tubes, urinary bladder, intestines, or peritoneum; In rare cases, it can also be localized in other organs outside the pelvis, such as the diaphragm, pleura, abdominal wall, or central and peripheral nervous systems [2, 3]. It is associated with debilitating symptoms such as chronic pelvic pain, dysmenorrhea, and infertility, significantly impacting the quality of life for affected individuals. Recent studies increasingly advocate for the recognition and management of EM as a multisystem disorder, rather than limiting it to an obstetric and gynecological issue [4]. Clinically, it manifests with a broad spectrum of symptoms extending beyond the reproductive system, including migraine, depression, and eating disorders [4]. Furthermore, individuals with EM are at an elevated risk for a range of pelvic and extrapelvic comorbidities, such as cancer, autoimmune diseases, allergic conditions, and cardiovascular complications [4]. Despite the significant impact of EM on women's physical and mental health, the underlying mechanisms driving its pathogenesis remain poorly understood. The etiology of EM is complex and multifactorial, involving factors such as retrograde menstruation, immune system dysregulation, benign metastasis, hormonal imbalances, coelomic metaplasia, stem cell contributions, changes in epigenetic regulation, and environmental influences [1, 5]. The recent identification of kisspeptin as a key mediator of internal and external signals on the hypothalamic-pituitary-gonadal axis has provided new insights into the neuroendocrine regulation of the human reproductive system, suggesting its potential involvement in processes such as metabolism, inflammation, and pain sensitivity in EM [6]. Currently, no single pathophysiological or molecular mechanism has been identified that fully explains all cases.

In recent years, there has been growing interest in exploring the role of the immune system in the development and progression of EM [7–13]. Dysregulation of immune responses, particularly involving various immune cell populations, has been implicated in the pathophysiology of EM [2, 7, 10, 13, 14].

The complex interplay between the immune system and endometriotic lesions involves intricate cellular and molecular mechanisms. Among the diverse immune cell types, B cells, CDCs (complement-dependent cytotoxic cells), stages of T cell maturation, monocytes, myeloid cells, TBNK (T cells, B cells, natural killer cells), and Treg (regulatory T cells) have been of particular interest due to their potential roles in modulating inflammatory signals, immune surveillance, and tissue remodeling processes [2, 7, 8, 12, 14, 15].

Numerous studies have provided evidence for alterations in immune cell populations and their functional activities in women with EM. For instance, aberrant B cell responses, including altered antibody production and autoantibody profiles, have been observed in both peripheral blood and peritoneal fluid of EM patients [7, 14, 16]. Disturbances in T cell subsets, such as an imbalance between Th1 and Th2 cells, have also been reported, suggesting a potential role for T cell-mediated immune dysregulation in EM development [2]. Additionally, the involvement of monocytes, myeloid cells, and regulatory T cells in the establishment and maintenance of endometriotic lesions has been proposed [11, 12, 15].

To elucidate the association between immune cell populations and EM, this study aims to employ a Mendelian randomization (MR) analysis approach. Leveraging data from a comprehensive panel of 731 immunophenotypes sourced from a genome-wide association study (GWAS) database, we will explore the potential correlation of these immune cell types on the risk and pathophysiology of EM. By utilizing genetic variants as instrumental variables, MR enables us to overcome confounding biases and provide insights into the relationships between immune cell biology and EM.

Understanding the intricate interactions between immune cell populations and the development of EM holds great promise for the identification of novel therapeutic targets and the development of personalized treatment strategies. This research endeavor may contribute to improved management and care for women affected by EM, ultimately alleviating the burden imposed by this complex and prevalent disease.

### Methods

#### Study design

We used a two-sample MR analysis to assess association between 731 immune cell features and EM. According to Bownden et al. [17], the two-sample MR analysis satisfied the following three assumptions: (1) The instrumental variables (IVs) chosen from the datasets were associated with the exposure; (2) The IVs were not associated with any unobserved confounders of the exposure; and (3) The IVs were associated with the outcomes solely through the exposure and not through any other pathways. The study's exposure and outcome samples consisted of human individuals, and it involved a secondary analysis of previously published data that had already received ethical approval and informed consent. Consequently, obtaining additional ethical approval or informed consent was unnecessary. The study design and workflow are presented in Fig. 1.



Fig. 1 The study design and workflow of the present MR study

#### Data sources

The summary statistics for each immunophenotype can be publicly accessed from the GWAS catalog (accession numbers from GCST90001391 to GCST90002121) [18]. A total of 731 blood-derived immunophenotypes were included, encompassing absolute cell (AC) counts (n=118), median fluorescence intensity (MFI) reflecting surface antigen levels (n=389), morphological parameters [MP] (n=32), and relative cell (RC) counts (n=192). Specifically, MFI, AC, and RC features include B cells, CDCs, stages of T cell maturation, monocytes, myeloid cells, TBNK (T cells, B cells, natural killer cells), and Treg panel, while MP features include CDC and TBNK panel. The original GWAS for immunophenotypes was conducted using data from 3,757 European individuals with no overlapping cohorts. Summary statistics for EM GWAS in the FinnGen cohort can be accessed through the R package TwoSampleMR (v 0.5.6), utilizing the IEU OpenGWAS database (https://gwas.mrcieu.ac.uk/) with the recorded GWAS ID "finn-b-N14\_ENDOMETRIO-SIS". In FinnGen, EM is defined as N80 in ICD-10, 617 in ICD-9, and 6253 in ICD-8. The GWAS summary statistics for EM in FinnGen include 8,288 cases and 68,969 controls.

#### Instrumental variables selection

We employ instrumental variables to investigate the association between immune cells and EM. Based on recent research, the significance level for each immunophenotype's instrumental variable is set at  $1 \times 10^{-5}$  [18, 19]. We utilize clumping based on linkage disequilibrium (LD) to remove strong LD (r<sup>2</sup>=0.001, window size=10000 kb). The clumping step is performed using the European reference panel from the 1000 Genomes Project, which is used to estimate LD between SNPs.

#### Statistical analysis

To assess the association between 731 immune phenotypes and EM, we primarily used the "Mendelian Randomization" package (version 0.4.3) for inverse variance-weighted (IVW), weighted median, MR Egger, Simple mode, and Weighted mode [17, 20-25]. These methods were carefully selected to address potential biases and ensure the validity of our findings. Specifically, MR-Egger regression was used to correct for directional pleiotropy, while the Weighted Median, Simple Mode, and Weighted Mode methods were utilized to account for heterogeneity in the correlation effect estimates. Additionally, MR-PRESSO was employed to identify and correct for any potential outliers that might have significantly affected the results. The "leave-one-out" sensitivity analysis was applied for exploring whether there was a single SNP which created bias to influence the overall association effect. The scatter plots demonstrated that the results were not influenced by outliers, while the funnel plots exhibited robustness of the correlation and no heterogeneity. Overall, these complementary approaches provided robust and reliable estimates of the relationship between immune cell features and EM.

#### Results

## Exploration of the association effect of immunophenotypes on EM

To investigate the relationship between EM and immunophenotypes, a two-sample MR analysis was conducted, with the IVW method being utilized as the primary analysis approach. We identified statistically significant differences in 22 immune phenotypes(p < 0.05), with 3 in the B cell panel, 1 in the cDC panel, 6 in the TBNK panel, 5 in the Treg panel, 2 in the Myeloid cell panel, 2 in the Monocyte panel, and 3 in the Maturation stages of T cell panel(Fig. 2). The MR results demonstrate that the immune cells associated with an increased risk of EM include: CD24+CD27+ %lymphocyte, CD33br HLA DR+CD14- %CD33br HLA DR+, CM CD8br AC, HLA DR+NK %NK, Granulocyte AC, CD19 on IgD+CD38br, CD28 on CD39+activated Treg, CD45 on NK, CD127 on T cell, CD25 on CD28+CD4+, CX3CR1 on monocyte, CD45 on lymphocyte.Furthermore, the MR results reveal that the immune cells associated with a protective effect against EM include: CD11c+HLA DR++monocyte %monocyte, CD25hi CD45RA+CD4 not Treg AC, Naive DN (CD4-CD8-) %DN, DN (CD4-CD8-) %leukocyte, HLA DR+T cell AC, CD25 on IgD- CD38br, CD25 on CD39+CD4+, CCR2 on CD14+CD16+monocyte, CD8 on TD CD8br, HLA DR on HLA DR+CD8br. The robustness of the observed associations was confirmed through the results obtained from the other four methods and sensitivity analysis (Supplementary Table). Additionally, scatter plots and funnel plots demonstrated the consistency and reliability of the findings (Supplementary Figure).

lower risk higher risk

Exposure	Panel	Outcome	Method	I	OR(95%CI)	Р
CD24+ CD27+ %lymphocyte	B cell	Endometriosis	IVW	-	1.024( 1.001, 1.047	) 0.037
CD19 on IgD+ CD38br	B cell	Endometriosis	IVW	-	1.006( 1.000, 1.012	) 0.041
CD25 on IgD- CD38br	B cell	Endometriosis	IVW		0.932( 0.873, 0.994	) 0.034
CD11c+ HLA DR++ monocyte %monocyte	cDC	Endometriosis	IVW		0.953( 0.918, 0.989	) 0.011
CM CD8br AC	Maturation stages of T cell	Endometriosis	IVW		1.059( 1.000, 1.122	) 0.046
Naive DN (CD4-CD8-) %DN	Maturation stages of T cell	Endometriosis	IVW		0.934( 0.878, 0.995	) 0.034
CD8 on TD CD8br	Maturation stages of T cell	Endometriosis	IVW		0.948( 0.903, 0.995	0.033
CCR2 on CD14+ CD16+ monocyte	Monocyte	Endometriosis	IVW	-	0.973( 0.950, 0.998	) 0.034
CX3CR1 on monocyte	Monocyte	Endometriosis	IVW	_•	1.071( 1.025, 1.119	0.002
CD33br HLA DR+ CD14- %CD33br HLA DR+	Myeloid cell	Endometriosis	IVW	-	1.035( 1.002, 1.068	) 0.035
CD45 on lymphocyte	Myeloid cell	Endometriosis	IVW		1.058( 1.011, 1.108	0.015 (
DN (CD4-CD8-) %leukocyte	TBNK	Endometriosis	IVW		0.959( 0.929, 0.989	0.008
HLA DR+ T cell AC	TBNK	Endometriosis	IVW	-	0.971( 0.945, 0.998	0.038
HLA DR+ NK %NK	TBNK	Endometriosis	IVW		1.044( 1.000, 1.089	) 0.049
Granulocyte AC	TBNK	Endometriosis	IVW		1.060( 1.004, 1.119	0.035
CD45 on NK	TBNK	Endometriosis	IVW		1.042( 1.000, 1.085	) 0.046
HLA DR on HLA DR+ CD8br	TBNK	Endometriosis	IVW		0.933( 0.881, 0.988	0.017
CD25hi CD45RA+ CD4 not Treg AC	Treg	Endometriosis	IVW		0.966( 0.934, 0.998	) 0.040
CD28 on CD39+ activated Treg	Treg	Endometriosis	IVW		1.047( 1.014, 1.081	) 0.004
CD127 on T cell	Treg	Endometriosis	IVW		1.063( 1.000, 1.129	) 0.046
CD25 on CD39+ CD4+	Treg	Endometriosis	IVW		0.966( 0.936, 0.997	0.037
CD25 on CD28+ CD4+	Treg	Endometriosis	IVW	0.6 0.8 1 1.2	1.148( 1.026, 1.285 1.4	) 0.015

Fig. 2 Forest plots of MR estimates of genetic association between immune traits and EM. IVW, inverse variance weighting; CI, confidence interval; OR, odds ratio; MR, Mendelian randomization

## Exploration of the association of EM onset on immunophenotypes

Based on the MR analysis, we have obtained the following results. Firstly, we observed the impact of EM, as an exposure factor, on various immunophenotypes. We identified statistically significant differences in 11 immune phenotypes(*p*<0.05), with 1 in the cDC panel, 4 in the TBNK panel, 1 in the Treg panel, 1 in the Myeloid cell panel, 1 in the Monocyte panel, and 3 in the Maturation stages of T cell panel(Fig. 3). EM is associated with an increase in CD11c+monocyte %monocyte, and a decrease in CD33br HLA DR+CD14dim %CD33br HLA DR+, CD4+CD8dim AC, CD4+CD8dim %lymphocyte, CD4+CD8dim %leukocyte, CD3 on TD CD8br, HVEM on naive CD8br, HVEM on CM CD8br, CD25 on CD39+CD4+, PDL-1 on CD14+CD16+monocyte, and CD8 on NKT. We confirmed the strength of the associations we found by using four additional methods and conducting a sensitivity analysis (Supplementary Table). We also used scatter plots and funnel plots to show that the results were consistent and reliable (Supplementary Figure), which further supports the validity of our findings.

#### Discussion

Utilizing extensive publicly accessible genetic data, we conducted an investigation into the associative links between 731 immune cell traits and EM. To the best of our knowledge, this study represents the first bidirectional MR analysis examining the correlational relationship between numerous immunophenotypes and EM. Our findings revealed significant relational effects of 22 immunophenotypes on EM, while also establishing that EM exerts relational effects on 11 immunophenotypes. These findings provide valuable insights into the potential immunological mechanisms underlying the development and progression of EM.

Our findings revealed several risk factors and a protective factor associated with EM, as identified in B lymphocytes. This study demonstrates that the increased percentages of immune cells CD24+CD27+ %lymphocyte, and CD19 on IgD+CD38br are associated with an elevated risk of developing EM. The characterization of human B cell populations depends on the presence of specific surface markers, primarily including CD20, CD19, CD24, CD38, and CD27 [26]. CD19, CD24, and CD27 are capable of producing IL-10, and numerous studies have indicated a significant increase in IL-10 levels in ectopic lesions, peripheral blood, and peritoneal fluid of patients with EM [26-28]. This study demonstrates that CD25 on IgD- CD38br cells is a protective factor in EM, which contradicts previous research findings [29, 30]. CD25 is the  $\alpha$  chain of the IL-2 receptor and plays a key role in the responsiveness to IL-2, triggering the activation of T lymphocytes and further production of IL-2. IL-2 is known to be instrumental in the immune response, particularly in cellular response, and it appears to effectively address immunological defects associated with EM in vitro [29]. When administered intraperitoneally, both rat IL-2 and human IL-2 exhibit a similar effect in reducing experimental EM, indicating a non-speciesspecific effect [30].

Dendritic cells (DCs) are immune cells that play a crucial role in antigen presentation during immune responses [31]. They possess the ability to induce both immune rejection and immune tolerance, and are involved in the regulation of T cell differentiation and the secretion of immunomodulatory molecules [32–34]. Previous studies have shown a close association between dendritic cells and the occurrence and development of EM [35–39]. This study reveals a significant correlation between CD11c+monocyte %monocyte, CD11c+HLA DR++monocyte %monocyte, and EM; however, the specific underlying mechanisms still require further investigation.

Exposure	Outcome	Panel	Metho	d	OR(95%CI)	Р
Endometriosis	CD11c+ monocyte %monocyte	cDC	IVW	; <b></b> ■	1.139(1.007, 1.289)	0.037
Endometriosis	CD3 on TD CD8br	Maturation stages of T cell	IVW	_ <b>-</b>	0.846(0.733, 0.977)	0.023
Endometriosis	HVEM on naive CD8br	Maturation stages of T cell	IVW	_ <b>_</b> ;	0.824(0.684, 0.993)	0.041
Endometriosis	HVEM on CM CD8br	Maturation stages of T cell	IVW		0.827(0.686, 0.996)	0.045
Endometriosis	PDL-1 on CD14+ CD16+ monocyte	Monocyte	IVW		0.887(0.790, 0.997)	0.044
Endometriosis	CD33br HLA DR+ CD14dim %CD33br HLA DR+	Myeloid cell	IVW		0.822(0.697, 0.969)	0.019
Endometriosis	CD4+ CD8dim AC	TBNK	IVW		0.861(0.745, 0.995)	0.043
Endometriosis	CD4+ CD8dim %lymphocyte	TBNK	IVW		0.852(0.739, 0.983)	0.028
Endometriosis	CD4+ CD8dim %leukocyte	TBNK	IVW	<b></b> ;	0.845(0.732, 0.975)	0.021
Endometriosis	CD8 on NKT	TBNK	IVW		0.860(0.761, 0.973)	0.017
Endometriosis	CD25 on CD39+ CD4+	Treg	IVW		0.864(0.760, 0.982)	0.026
				0.6 0.8 1 1.2 1 lower risk higher	4 risk	

Fig. 3 Forest plots of MR estimates of genetic association between EM and immune traits. IVW, inverse variance weighting; CI, confidence interval; OR, odds ratio; MR, Mendelian randomization

T lymphocytes arise from hematopoietic progenitor cells in the bone marrow and subsequently undergo migration to the thymus. Following their differentiation and maturation within the thymus, T lymphocytes disperse to immune organs and tissues throughout the body, where they exert immune functions via circulation through lymphatic vessels, bloodstream, and tissue fluid [40]. T lymphocytes account for 1-2% of the total endometrial cell population, and their distribution varies throughout the menstrual cycle [41-43]. During the proliferative phase, they constitute 40-60% of the total leukocyte count in normal endometrial cells, while their proportion decreases to less than 10% during the secretory phase [44]. Based on different cell surface markers and functions, mature T lymphocytes can be classified into distinct subsets, including CD8-expressing cells (cytotoxic T lymphocytes), CD4-expressing cells (helper T lymphocytes), and cells that do not express CD8 or CD4. The CD4+cell population includes helper T lymphocytes 1, 2 (Th1, Th2), Th17, as well as regulatory T lymphocytes (Treg) [45, 46]. Previous studies have shown a close relationship between T lymphocytes and related cytokines in the development and progression of EM, with possible imbalances in the Th1/Th2 or Th17/Treg immune responses [44, 47-50]. This study demonstrates that three maturation stages of T cell immunophenotypes and five Treg cell immunophenotypes have significant associative effects on EM. Additionally, EM was found to have associative effects on one Treg cell immunophenotype and three maturation stages of T cell immunophenotypes. However, it should be noted that further research is required to fully comprehend the specific mechanisms involved.

It is widely recognized that lymphocytes, in addition to T lymphocytes (T cells), encompass B lymphocytes ( B cells) and natural killer (NK) cells. B cells play a crucial role in the humoral immune response by generating antibodies against foreign antigens. Within the normal eutopic endometrium, B cells constitute approximately 1–2% of the total leukocyte population and exhibit no dependence on the menstrual cycle [51]. NK cells, comprising approximately 5–15% of peripheral blood lymphocytes, are vital components of the innate immune system [52, 53]. Within the human endometrium, uterine natural killer (uNK) cells represent the major leukocyte population, constituting 30–40% of total leukocytes in the proliferative phase and up to 70% in the secretory phase [44, 53].

Previous research has indicated that B lymphocytes and NK cells are involved in the pathogenesis and progression of EM [52–59]. The role of NK cells in the development of EM was initially documented by Oosterlynck et al., who reported a decreased cytotoxic activity of NK cells against ectopic endometrial cells [60]. This phenomenon was particularly evident in NK cells present in the peritoneal fluid, but it was also observed in NK cells circulating in the peripheral blood [10, 61]. However, the mechanism underlying the inhibition of NK cell function in EM has not been fully elucidated. Similarly, there is considerable controversy surrounding the role of B cells in EM. Although numerous studies have demonstrated that B cells within ectopic EM lesions, as well as in peritoneal fluid and serum, generate autoantibodies or antibodies specifically targeting endometrial epitopes [62, 63], there is a lack of consensus regarding the concentration of B cells and their roles in this disorder.

Studies have reported varying results regarding the number of B cells in peritoneal fluid and circulation in EM patients compared to control subjects, with some reporting an increase [57, 64–73], others a decrease [74, 75], and still others finding no significant differences [76–81]. The findings of this study provide compelling evidence that six TNBK cell immunophenotypes play a substantial relational role in the development and progression of EM. Furthermore, the study reveals that EM also exerts associative effects on four additional TBNK cell immunophenotypes.

Macrophages (Mø) play a crucial role as part of the mononuclear phagocyte system (MPS).Mø are crucial cells in both innate and humoral immunity, as they have the ability to recognize and phagocytose pathogens, act as antigen-presenting cells (APC) to activate T cells, and contribute to tissue regeneration. These functions are essential for their role in the endometrium [11, 82]. Macrophages (Mø) can be classified into two categories based on their activation state and surface markers: 'classically activated' Mø (Mø1) and 'alternatively activated' Mø (Mø2). Mø1 are responsible for secreting pro-inflammatory factors, while Mø2 play a role in angiogenesis, anti-inflammatory processes, and coordinating tissue repair [82, 83]. There has been a notable rise in the quantity of macrophages observed in the eutopic endometrium of women with EM [84, 85]. As Mø2 predominate in ectopic EM lesions, the resulting anti-inflammatory environment fosters lesion formation, activates T cellmediated responses, and promotes angiogenesis [86]. Other factors that contribute to the formation of endometriotic lesions include the reduced phagocytic function of peritoneal macrophages in women with EM, as well as the production of vascular endothelial growth factor (VEGF) by these macrophages, which plays a critical role in angiogenesis [86-88]. Moreover, the production of inflammatory mediators by macrophages promotes the implantation and proliferation of endometrial cells, contributing to the development of endometrial lesions [89]. In women diagnosed with EM, the prevalence of the proinflammatory phenotype of endometrial Mø1 and secretion of pro-inflammatory cytokines create an unfavorable

milieu for successful implantation and progression of pregnancy [90]. Additionally, the presence of Mø2 within the peritoneal cavity and lesions in women with EM may potentially contribute to the sensation of pain by facilitating the growth of nerve fibers [91, 92]. This study provides evidence for the significant associative effects of two specific monocyte cell immunophenotypes on the development of EM. Additionally, reciprocal MR analysis revealed that EM exerts an associative influence on one particular monocyte cell immunophenotype.

Different types of myeloid cells can be identified based on the expression of PDL-1, CD33, HLA-DR, CD14, CD45, and CD16 [93–101]. Studies have indicated that myeloid cells play a significant role in the occurrence and development of EM [99, 102–108]. This study presents compelling evidence supporting the substantial correlational impact of three distinct immunophenotypes of monocyte cells on the progression of EM. Moreover, reciprocal MR analysis uncovered that EM exhibits a causative influence on a specific immunophenotype of monocyte cells. Nevertheless, it is important to acknowledge that additional investigations are necessary to gain a comprehensive understanding of the precise underlying mechanisms involved in this process.

It is important to note that our study utilized MR, which provides evidence for associative relationships between exposures and outcomes. However, further functional studies are needed to elucidate the precise mechanisms by which these immune cells contribute to EM pathogenesis. Additionally, the results from our sensitivity analyses and alternative MR methods supported the robustness of the observed associations, enhancing the reliability of our findings.

It is essential to recognize the limitations present in our research. First and foremost, the study utilized publicly accessible genetic data, which may be limited in terms of sample size, diversity of populations, and representation of genetic variants associated with immune cells and EM. Secondly, our application of MR presupposes that genetic variants are independent from confounding variables, which could introduce bias into our interpretations of the associations. Even though we meticulously selected genetic instruments that have a strong correlation with the exposure, the issue of residual pleiotropy persists and could compromise the accuracy of our findings. While MR provides evidence supporting associations, the complex interactions between immune cells and EM involve biological mechanisms that are not fully captured by the genetic instruments used in this study. Thirdly, Our study primarily focused on genetic associations and did not account for potential confounding factors. Future research incorporating comprehensive clinical and lifestyle data-such as BMI, age, treatment history, and menopausal status-will be necessary to overcome this limitation. Furthermore, our research findings are derived from populations of European ancestry, which restricts the applicability of results to other ethnic demographics. Lastly, the relatively modest sample size may also hinder the broader applicability of our conclusions. To substantiate our results and clarify the underlying mechanisms, further validation through replication in independent cohorts, as well as functional studies, is imperative.

In conclusion, our study highlights the potential correlational role of specific immune cell phenotypes in the development and onset of EM. These findings contribute to our understanding of the immunological mechanisms underlying this complex disease. Future research focusing on these immune cell populations may provide novel targets for therapeutic interventions and personalized treatment strategies for EM patients.

#### Supplementary Information

The online version contains supplementary material available at https://doi.or g/10.1186/s12905-024-03493-2.

Supplementary Material 1: Supplementary Figure: Results of sensitivity analysis and visualization of the association between immune cells and endometriosis

Supplementary Material 2: Supplementary Table: A summary of 731 immune cell types and MR analysis results on the association between immune cells and endometriosis

#### Acknowledgements

We sincerely thank the participants and investigators of the FinnGen study for making the GWAS data publicly accessible.

#### Author contributions

L.P. and Z.Z. contributed to the methodology and design. S.M. and Y. Cao. was involved in material preparation and data collection. L.P. and Y. Chen performed analyses. L.P., Y. Chen, and Z.Z. contributed to writing-original draft, writing-review and editing. Y.M. provided funding acquisition, resources, and study conceptualization. All authors have read and agreed to the published version of the manuscript.

#### Funding

This work was supported by Guangdong Basic and Applied Basic Research Foundation (Grant Nos. 2022A1515011880, 2023A1515011688), and the President Foundation of Zhujiang Hospital, Southern Medical University (Grant No. yzjj2022ms18) to Ying Ma.

#### Data availability

All the data included in this manuscript were previously deposited in public repositories and they were accessible and free to download. The GWAS summary statistics for each immune trait are publicly available from the GWAS Catalog (accession numbers from GCST90001391 to GCST90002121)(https://www.ebi.ac.uk/gwas/). The GWAS summary statistics for endometriosis are available on the IEU GWAS database (https://gwas.mrcieu.ac.uk/) for FinnGen.

#### Declarations

#### **Competing interests**

The authors declare no competing interests.

Institutional review board statement

Not applicable.

#### Informed consent statement

Not applicable.

Received: 4 May 2024 / Accepted: 4 December 2024 Published online: 19 December 2024

#### References

- 1. Zondervan KT, Becker CM, Missmer SA. Endometr New Engl J Med. 382(13): pp. 1244–56.
- Lamceva J, Uljanovs R, Strumfa I. The main theories on the pathogenesis of endometriosis. Int J Mol Sci. 2023;24(5):4254.
- Saunders PTK, Horne AW. Endometriosis: etiology, pathobiology, and therapeutic prospects. Cell. 2021;184(11):2807–24.
- 4. Xu Y et al. An overview and comprehensive analysis of interdisciplinary clinical research in endometriosis based on trial registry. Iscience, 2024.
- Lamceva J, Uljanovs R. I.J.I.j.o.m.s. Strumfa. main Theor Pathogenesis Endometr. 2023;24(5):4254.
- Salmeri N et al. The kisspeptin system in and beyond reproduction: exploring intricate pathways and potential links between endometriosis and polycystic ovary syndrome. 2024. 25(2): pp. 239–57.
- Izumi G, et al. Involvement of immune cells in the pathogenesis of endometriosis. J Obstet Gynecol Res. 2018;44(2):191–8.
- Li W, et al. Immunotherapy: a promising novel endometriosis therapy. Front Immunol. 2023;14:1128301.
- Moghaddam MZ et al. Immunopathogenesis of endometriosis: an overview of the role of innate and adaptive immune cells and their mediators. 2022. 87(5): p. e13537.
- 10. Riccio LdGC, et al. Immunol Endometr. 2018;50:39-49.
- Vallvé-Juanico J, Houshdaran S, Giudice LC. The endometrial immune environment of women with endometriosis. Hum Reprod Update. 2019;25(5):565–92.
- 12. Zhang T et al. The link between immunity, autoimmunity and endometriosis: a literature update. 2018. 17(10): pp. 945–55.
- 13. Abramiuk M et al. The role of the immune system in the development of endometriosis. 2022. 11(13): p. 2028.
- Lebovic DI, Mueller MD, Taylor RN. Immunobiology of endometriosis. Fertil Steril. 2001;75(1):1–10.
- 15. Guo Q et al. Pyroptosis orchestrates immune responses in endometriosis. 2023. 118: p. 110141.
- Hever A et al. Human endometriosis is associated with plasma cells and overexpression of B lymphocyte stimulator. Proceedings of the National Academy of Sciences, 2007. 104(30): pp. 12451–12456.
- Bowden J, Davey Smith G, Burgess S. Mendelian randomization with invalid instruments: effect estimation and bias detection through Egger regression. Int J Epidemiol. 2015;44(2):512–25.
- 18. Orrù V, et al. Complex genetic signatures in immune cells underlie autoimmunity and inform therapy. Nat Genet. 2020;52(10):1036–45.
- 19. Wang C, et al. Causal role of immune cells in schizophrenia: mendelian randomization (MR) study. BMC Psychiatry. 2023;23(1):590.
- Bowden J, et al. Consistent estimation in mendelian randomization with some Invalid instruments using a weighted median estimator. Genet Epidemiol. 2016;40(4):304–14.
- Burgess S, Thompson SG. Interpreting findings from mendelian randomization using the MR-Egger method. Eur J Epidemiol. 2017;32(5):377–89.
- 22. Slob EAW, Burgess S. A comparison of robust mendelian randomization methods using summary data. Genet Epidemiol. 2020;44(4):313–29.
- 23. Verbanck M, et al. Detection of widespread horizontal pleiotropy in causal relationships inferred from mendelian randomization between complex traits and diseases. Nat Genet. 2018;50(5):693–8.
- Hartwig FP, Davey Smith G, Bowden J. Robust inference in summary data mendelian randomization via the zero modal pleiotropy assumption. Int J Epidemiol. 2017;46(6):1985–98.
- 25. Hemani G et al. The MR-Base platform supports systematic causal inference across the human phenome. Elife, 2018. 7.
- de Masson A et al. Purification and immunophenotypic characterization of human B cells with regulatory functions. 2014: pp. 45–52.
- Cencioni MT et al. Defective CD19 + CD24hiCD38hi transitional B-cell function in patients with relapsing-remitting MS. 2021. 27(8): pp. 1187–97.
- 28. Zhou W-J, et al. Anti-inflammatory Cytokines Endometr. 2019;76:2111-32.

- 29. Melioli G et al. Recombinant interleukin-2 corrects in vitro the immunological defect of endometriosis. 1993. 30(4): pp. 218–27.
- Quereda F, et al. The effect of intraperitoneal interleukin-2 on surgically induced endometriosis. rats. 2008;136(2):243–8.
- 31. Steinman RM. J.A.r.o.i., *Decisions about dendritic cells: past, present, and future.* 2012. 30: pp. 1–22.
- 32. de Gardner A. Mingo Pulido, and B.J.F.i.i. Ruffell. Dendritic Cells Their role Immunotherapy. 2020;11:924.
- 33. Ueno H, et al. Dendritic cell Subsets Health Disease. 2007;219(1):118-42.
- 34. Waisman A, et al. Dendritic cells as gatekeepers of tolerance. In seminars in immunopathology. Springer; 2017.
- 35. Fainaru O, et al. Dendritic cells support angiogenesis and promote lesion growth. Murine Model Endometr. 2008;22(2):522–9.
- Hey-Cunningham A et al. Comprehensive analysis utilizing flow cytometry and immunohistochemistry reveals inflammatory changes in local endometrial and systemic dendritic cell populations in endometriosis. 2021. 36(2): pp. 415–428.
- Pencovich N et al. The development of endometriosis in a murine model is dependent on the presence of dendritic cells. 2014. 28(4): pp. 515–21.
- 38. Qiaomei Z et al. Features of peritoneal dendritic cells in the development of endometriosis. 2023. 21(1): pp. 1–8.
- Schulke L et al. Dendritic cell populations in the eutopic and ectopic endometrium of women with endometriosis. 2009. 24(7): pp. 1695–703.
- Kumar BV, Connors TJ, Farber DLJI. Human T cell development, localization, and function throughout life. 2018. 48(2): pp. 202–13.
- Flynn L et al. Menstrual cycle dependent fluctuations in NK and T-lymphocyte subsets from non-pregnant human endometrium. 2000. 43(4): pp. 209–17.
- 42. Salamonsen LA. And D.E.J.J.o.r.i. Woolley. Menstruation: Induction Matrix Metalloproteinases Inflamm Cells. 1999;44(1–2):1–27.
- Yang X, Gilman-Sachs A. J.J.o.r.i. Kwak-Kim. Ovarian Endometrial Immun Dur Ovarian Cycle. 2019;133:7–14.
- Vallvé-Juanico J, Houshdaran S. C.J.H.r.u. Giudice. Endometrial Immune Environ Women Endometr. 2019;25(5):565–92.
- 45. Zhu J, Paul WE. CD4 T cells: fates, functions, and faults. Blood. 2008;112(5):1557–69.
- Wingender G, Kronenberg MJCa. OMIP-030: characterization of human T cell subsets via surface markers. 2015. 87(12): pp. 1067–9.
- Chang L-Y et al. Synergy between Th1 and Th2 responses during endometriosis: A review of current understanding. 2023: p. 103975.
- Khan KN et al. Differential levels of regulatory T cells and T-helper-17 cells in women with early and advanced endometriosis. 2019. 104(10): pp. 4715–29.
- 49. Olkowska-Truchanowicz J et al. Peritoneal fluid from patients with ovarian endometriosis displays immunosuppressive potential and stimulates Th2 response. 2021. 22(15): p. 8134.
- Tanaka Y et al. Exacerbation of endometriosis due to regulatory T-cell dysfunction. 2017. 102(9): pp. 3206–17.
- Salamonsen LA. And L.J.J.H.r.u. Lathbury. Endometrial Leukocytes Menstruation. 2000;6(1):16–27.
- Thiruchelvam U, Wingfield M, C.J.A.J.o.R I, O'Farrelly. Increased uNK Progenit Cells Women Endometr Infertility are Assoc low Levels Endometrial stem cell Factor. 2016;75(4):493–502.
- 53. Manaster I et al. Endometrial NK cells are special immature cells that await pregnancy. 2008. 181(3): pp. 1869–76.
- Hoogstad-van Evert J, et al. Promises Nat Killer cell Therapy Endometr. 2022;23(10):5539.
- 55. Osuga Y, et al. Lymphocytes Endometr. 2011;65(1):1-10.
- 56. Reis JL, et al. Nat Killer Cell Receptors Endometriosis: Syst Rev. 2022;24(1):331.
- 57. Riccio LG et al. The role of the B lymphocytes in endometriosis: a systematic review. 2017. 123: pp. 29–34.
- Shen M et al. The role of endometrial B cells in normal endometrium and benign female reproductive pathologies: a systematic review. 2022. 2022(1): p. hoab043.
- Thiruchelvam U, Wingfield M, C.J.A. J.o.R.I. O'Farrelly. Nat Killer Cells: Key Players Endometr. 2015;74(4):291–301.
- OOSTERLYNCK DJ, et al. Immunosuppressive Activity Perit Fluid Women Endometr. 1993;82(2):206–12.
- Ho H-N et al. Peritoneal natural killer cytotoxicity and CD25+CD3+lymphocyte subpopulation are decreased in women with stage III–IV endometriosis. 1995. 10(10): pp. 2671–5.
- 62. Gajbhiye R, et al. Multiple Endometrial Antigens are Target Autoimmune Endometr. 2008;16(6):817–24.
- 63. Straub RHJEr. Complex role Estrogens Inflamm. 2007;28(5):521-74.

- 65. Badawy SZ et al. The regulation of immunoglobulin production by B cells in patients with endometriosis. 1989. 51(5): pp. 770–3.
- Berbic M et al. A novel pilot study of endometrial stromal cells and immune cell populations in sentinel uterine-draining lymph nodes during the menstrual cycle and in endometriosis. 2013. 20(11): pp. 1339–1348.
- 67. Chishima F et al. *Peritoneal and peripheral B-1-cell populations in patients with endometriosis.* 2000. 26(2): pp. 141–149.
- 68. Gleicher N, et al. Is Endometr Autoimmune Disease? 1988;26(2):331-2.
- Hever A et al. Human endometriosis is associated with plasma cells and overexpression of B lymphocyte stimulator. 2007. 104(30): pp. 12451–6.
- Lachapelle M-H et al. Flow cytometric evaluation of leukocyte subpopulations in the follicular fluids of infertile patients. 1996. 65(6): pp. 1135–40.
- Odukoya O, Bansal A. and I.J.A.o.e.g.S. Cooke, serum endometrial IgG antibodies and soluble CD23 concentrations in patients with endometriosis. 1996. 75(10): pp. 927–31.
- 72. Odukoya O et al. Endometriosis: Soluble CD23 protein in the peritoneal fluid of patients with endometriosis. 1996. 11(9): pp. 2018–21.
- Scheerer C et al. Characterization of endometriosis-associated immune cell infiltrates (EMalCI). 2016. 294: pp. 657–64.
- 74. Gagné D et al. Blood leukocyte subsets are modulated in patients with endometriosis. 2003. 80(1): pp. 43–53.
- 75. Oosterlynck D et al. Immunohistochemical characterization of leucocyte subpopulations in endometriotic lesions. 1993. 253: pp. 197–206.
- Christofolini D et al. Promoter-817C > T variant of B lymphocyte stimulator gene (BLyS) and susceptibility to endometriosis-related infertility and idiopathic infertility in Brazilian Population. 2011. 74(6): pp. 628–31.
- 77. GEBEL HM et al. Mitogen induced production of polyclonal IgG is decreased in women with severe endometriosis. 1993. 29(2): pp. 124–30.
- Klentzeris LD, et al. Endometrial Leukoc Subpopulations Women Endometr. 1995;63(1):41–7.
- 79. Nomiyama M et al. Local immune response in infertile patients with minimal endometriosis. 1997. 44(1): pp. 32–7.
- Witz CA et al. Characterization of lymphocyte subpopulations and T cell activation in endometriosis. 1994. 32(3): pp. 173–9.
- Yeo S et al. Decreased Bcl-6 and increased Blimp-1 in the peritoneal cavity of patients with endometriosis. 2015. 42(2): pp. 156–160.
- 82. Jensen AL et al. A subset of human uterine endometrial macrophages is alternatively activated. 2012. 68(5): pp. 374–86.
- Mantovani A et al. The chemokine system in diverse forms of macrophage activation and polarization. 2004. 25(12): pp. 677–86.
- Berbic M, et al. Macrophage Expression Endometrium Women without Endometr. 2009;24(2):325–32.
- Hill JA, et al. Charact Leukoc Subpopulations Perit Fluid Women Endometr. 1988;50(2):216–22.
- Capobianco A. P.J.F.i.i. Rovere-Querini. Endometr Disease Macrophage. 2013;4:9.
- Chuang PC et al. Downregulation of CD36 results in reduced phagocytic ability of peritoneal macrophages of women with endometriosis. 2009. 219(2): pp. 232–41.
- Izumi G et al. Involvement of immune cells in the pathogenesis of endometriosis. 2018. 44(2): pp. 191–8.

- Grodstein F, Goldman MB, D.W.J.A.J.o.P H, Cramer. Infertility Women Moderate Alcohol use. 1994;84(9):1429–32.
- 90. Beste MT et al. Molecular network analysis of endometriosis reveals a role for c-Jun–regulated macrophage activation. 2014. 6(222): p. 222ra16-222ra16.
- Morotti M, et al. Peripheral Changes endometriosis-associated pain. 2014;20(5):717–36.
- 92. Tran LVP, et al. Macrophages Nerve Fibres Perit Endometr. 2009;24(4):835–41.
- Brandenburg S et al. Myeloid cells expressing high level of CD45 are associated with a distinct activated phenotype in glioma. 2017. 65: pp. 757–68.
  Caldwell CW et al. Surface and cytoplasmic expression of CD45 antigen
- Caldwell CW et al. Surface and cytoplasmic expression of CD45 antigen isoforms in normal and malignant myeloid cell differentiation. 1991. 95(2): pp. 180–7.
- 95. Fainaru O et al. Myeloid cell alterations in the mouse placenta precede the onset of labor and delivery. 2014. 210(1): p. 73. e1-73. e7.
- 96. Fromm PD et al. Distinguishing human peripheral blood CD16 + myeloid cells based on phenotypic characteristics. 2020. 107(2): pp. 323–39.
- 97. Millrud CR, Bergenfelz C, Leandersson KJO. On the origin of myeloid-derived suppressor cells. 2017. 8(2): p. 3649.
- Santoso B et al. Soluble immune checkpoints CTLA-4, HLA-G, PD-1, and PD-L1 are associated with endometriosis-related infertility. 2020. 84(4): p. e13296.
- 99. Sun Y et al. CD33+CD14+CD11b+HLA-DR-monocytic myeloid-derived suppressor cells recruited and activated by CCR9/CCL25 are crucial for the pathogenic progression of endometriosis. 2019. 81(1): p. e13067.
- 100. Wang K et al. Early myeloid-derived suppressor cells (HLA-DR–/low CD33+CD16–) expanded by granulocyte colony-stimulating factor prevent acute graft-versus-host disease (GVHD) in humanized mouse and might contribute to lower GVHD in patients post allo-HSCT. 2019. 12: pp. 1–16.
- 101. Zhu W-H et al. Erythroid-transdifferentiated myeloid cells promote portal vein tumor thrombus in hepatocellular carcinoma. 2023. 13(13): p. 4316.
- Barra F, SJ.A.J.o.R I, Ferrero. The role of monocytic myeloid-derived suppressor cells in the pathogenesis of endometriosis. 2019. 81(3): pp. e13094-e13094.
- 103. Chen Y et al. Alteration of myeloid-derived suppressor cells, chronic inflammatory cytokines, and exosomal miRNA contribute to the peritoneal immune disorder of patients with endometriosis. 2019. 26(8): pp. 1130–8.
- 104. Guo P et al. CCR5/CCR5 ligand-induced myeloid-derived suppressor cells are related to the progression of endometriosis. 2019. 39(4): pp. 704–11.
- Satake E et al. The roles of polymorphonuclear myeloid-derived suppressor cells in endometriosis. 2021. 148: p. 103371.
- Suszczyk D et al. The role of myeloid-derived suppressor cells (MDSCs) in the development and/or progression of endometriosis-state of the art. 2021. 10(3): p. 677.
- Zhang T et al. Myeloid-derived suppressor cells: a new emerging player in endometriosis, in International Review of Cell and Molecular Biology. 2023, Elsevier. pp. 191–220.
- Zheng ZM, et al. Myeloid-derived Suppressor Cells Obstetrical Gynecol Dis. 2020;84(2):e13266.

#### **Publisher's note**

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.