



EQTL Mendelian randomization to identify genetic insights and regulatory mechanisms in benign prostatic hyperplasia

Zhuoran Gu^{1,2,#}, Xinjian Pan^{1,2,#}, Dan Huang^{3,#}, Peiqian Ni^{4,#}, Libin Zou^{1,2}, Yuke Zhang^{1,2}, Yifan Chen^{1,2}, Weihua Song⁵, Yongjie Zhang⁵, Yadong Guo^{1,2}, Xudong Yao^{1,2}

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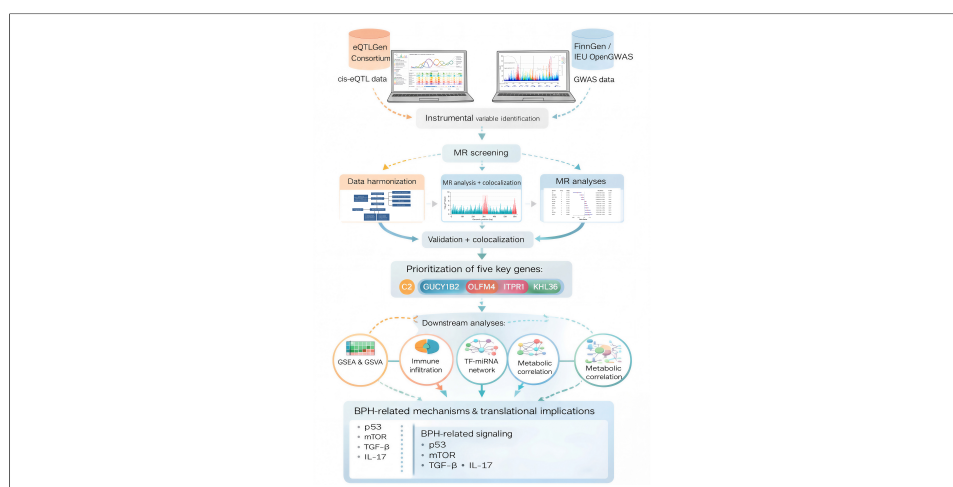
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Abstract

Aim: This study aims to identify key genes and regulatory mechanisms associated with benign prostatic hyperplasia (BPH) using expression quantitative trait locus (eQTL)-based Mendelian randomization and integrative bioinformatics analyses.

Methods: Cis-expression quantitative trait locus (cis-eQTL) data were obtained from the eQTLGen Consortium. Genome-wide association study (GWAS) summary statistics for BPH were retrieved from the FinnGen biobank and the IEU OpenGWAS database. Gene expression profiles were obtained from the Gene Expression Omnibus (GEO) database. Mendelian randomization and colocalization analyses were performed to prioritize BPH-associated genes. Subsequent analyses included gene set enrichment

¹Department of Urology, Shanghai Tenth People's Hospital, School of Medicine, Tongji University, Shanghai 200072, China.

²Urologic Cancer Institute, School of Medicine, Tongji University, Shanghai 200072, China.

³Department of Critical Care Medicine, Shanghai Tenth People's Hospital, School of Medicine, Tongji University, Shanghai 200072, China.

⁴Department of General Practice, Shanghai Tenth People's Hospital, School of Medicine, Tongji University, Shanghai 200072, China.

⁵Department of Nursing, Suzhou Wu Zhong People's Hospital, Suzhou 215000, China.

#These authors contributed equally to this work.

Correspondence to: Prof. Xudong Yao, Prof. Yadong Guo, Department of Urology, Shanghai Tenth People's Hospital, School of Medicine, Tongji University, Shanghai 200072, China. E-mail: yaoxudong1967@163.com; 1731191@tongji.edu.cn; Prof. Weihua Song, Prof. Yongjie Zhang, Department of Nursing, Suzhou Wu Zhong People's Hospital, Suzhou 215000, China. Email: songweihua1971@126.com; 13913113695@163.com

analysis (GSEA), gene set variation analysis (GSVA), immune infiltration analysis, transcription factor prediction, miRNA network construction, and metabolic correlation analysis.

Results: A total of 105 and 11 BPH-associated genes were identified in the training and validation datasets, respectively. Colocalization analysis further prioritized five key genes, including C2 (Complement Component 2), GUCY1B2 (Guanylate Cyclase 1 Soluble Subunit Beta 2), OLFM4 (Olfactomedin 4), ITPR1 (Inositol 1,4,5-Trisphosphate Receptor Type 1), and KLHL36 (Kelch Like Family Member 36). Functional analyses indicated that these genes were involved in multiple BPH-related pathways, including tumor protein p53 (p53), mechanistic target of rapamycin (mTOR), transforming growth factor-beta (TGF- β), and interleukin-17 (IL-17) signaling. These genes were also associated with immune cell infiltration, immune-related factors, transcriptional regulation, miRNA interactions, metabolic pathways, and disease-related gene networks.

Conclusion: Five candidate genes associated with BPH were identified, and their potential regulatory mechanisms were characterized through integrative genetic and transcriptomic analyses. These findings provide new insights into the molecular basis of BPH and may inform future biomarker development and mechanism-driven therapeutic strategies, although further experimental validation remains necessary.

INTRODUCTION

Benign prostatic hyperplasia (BPH) represents the most prevalent benign enlargement of the prostate gland and is a major cause of lower urinary tract symptoms (LUTS) in older men^[1]. Its pathological features include histological proliferation of prostatic stromal and glandular components, progressive anatomical enlargement of the prostate, urodynamic obstruction of the bladder outlet, and clinical manifestations primarily characterized by LUTS, all of which substantially compromise patients' quality of life^[1]. The incidence of BPH rises markedly with age, typically becoming clinically evident after 40 years^[1,2]. Prevalence exceeds 50% in men aged 60 years and reaches approximately 80% by 80 years of age^[1,2]. Dysregulation of the balance between proliferation and apoptosis in prostatic epithelial and stromal cells is regarded as a central mechanism in BPH pathogenesis^[3]. In addition, BPH development is multifactorial, involving androgens and their interaction with estrogens, stromal-epithelial crosstalk, growth factors, inflammatory cells, neurotransmitters, and genetic determinants^[3]. However, the underlying molecular mechanisms remain incompletely understood. The present study identified core genes and regulatory networks associated with BPH pathogenesis through Mendelian randomization and integrative analytical approaches.

Mendelian randomization (MR) is an analytical framework that leverages genetic variants as instrumental variables (IVs) to infer potential causal relationships between exposures and outcomes^[4]. Expression quantitative trait loci (eQTLs) are genetic variants associated with gene expression levels. eQTL-based MR integrates regulatory genetic variants with genome-wide association study (GWAS) data to evaluate the potential causal effects of gene expression on disease risk^[5]. This approach has been widely applied to complex diseases, including cancer, endocrine disorders, metabolic diseases, and immune-related conditions^[6-8]. Moreover, eQTL-based MR facilitates the prioritization of potential therapeutic targets by identifying genes whose expression levels may causally influence disease susceptibility^[9]. To date, no eQTL-based MR study has systematically examined the causal relationship between gene expression and BPH. In this study, datasets from eQTLGen, FinnGen, IEU OpenGWAS, and GEO were integrated to identify BPH-associated genes through MR and colocalization analyses. Five key genes - C2 (Complement Component 2), GUCY1B2 (Guanylate Cyclase 1 Soluble Subunit Beta 2), OLFM4 (Olfactomedin 4), ITPR1 (Inositol 1,4,5-Trisphosphate Receptor Type 1), and KLHL36 (Kelch Like Family Member 36) - were further characterized, and their potential biological functions and regulatory mechanisms in BPH were explored.

MATERIALS AND METHODS

Data acquisition

Cis-expression quantitative trait locus (cis-eQTL) data were obtained from the eQTLGen Consortium (<https://www.eqtlgen.org>), which catalogs genetic determinants of gene expression in whole blood and their contributions to complex human traits and diseases. In its second phase, the consortium conducted large-scale genome-wide meta-analyses of cis- and trans-eQTLs using whole-blood transcriptomes derived from multiple population-based cohorts.

Outcome GWAS data were restricted to individuals of European ancestry. Summary statistics for BPH were retrieved from the FinnGen biobank (FinnGen R10, N14_PROSTHYPERPLA), where cases were defined based on corresponding International Classification of Diseases (ICD) codes extracted from registry data. This dataset comprised 32,956 cases and 130,139 controls. Replication summary statistics were obtained from the IEU OpenGWAS database (EBI GWAS Catalog; GCST90044257), in which cases were likewise identified using ICD codes, including 6,505 cases and 202,303 controls for prostate hyperplasia.

Gene expression data were retrieved from the Gene Expression Omnibus (GEO; <https://www.ncbi.nlm.nih.gov/geo/info/datasets.html>), a comprehensive repository of functional genomic datasets. Dataset GSE132714, generated on the GPL16791 platform, was selected for transcriptomic analysis of BPH, comprising a control group (n = 4) and a disease group (n = 18).

Mendelian randomization analysis

Figure 1 summarizes the analytical workflow of this MR study. Outcome identifiers were screened from the FinnGen biobank, EBI, and GWAS catalog databases. These identifiers were then used to extract relevant causal associations from eQTL GWAS summary statistics data (<https://gwas.mrcieu.ac.uk/>). Single nucleotide polymorphisms (SNPs) associated with each gene at a locus-wide significance threshold of $P < 1 \times 10^{-5}$ were selected as candidate IVs. A relaxed threshold relative to the conventional genome-wide significance level ($P < 5 \times 10^{-8}$) was adopted to preserve cis-eQTL instrument availability and improve coverage for gene-level MR screening. To minimize false-positive findings, linkage disequilibrium (LD) clumping, validation in an independent dataset, leave-one-out sensitivity analysis, and colocalization analysis were subsequently performed. LD clumping, validation in an independent dataset, leave-one-out sensitivity analysis, and colocalization analysis were subsequently performed. Among SNPs with $R^2 < 0.001$ (clumping window = 10,000 kb), only variants with $P < 5 \times 10^{-5}$ were retained. Causal effects were estimated using four complementary MR methods, including inverse-variance weighted (IVW), MR-Egger, weighted median, and weighted mode approaches. The IVW method was used as the primary estimator due to its highest statistical efficiency under valid instrument assumptions or balanced horizontal pleiotropy, and its estimates were interpreted as the main causal effects. MR-Egger, weighted median, and weighted mode analyses were applied as sensitivity approaches to assess robustness. When only a single genetic variant was available, the Wald ratio method was used. The MR-Egger method relies on the InSIDE (Instrument Strength Independent of Direct Effect) assumption, which requires independence between instrument strength and direct pleiotropic effects. The weighted median estimator provides consistent estimates when more than 50% of instruments are valid, whereas the weighted mode method yields robust inference when the largest instrument cluster reflects the true causal effect.

Sensitivity analysis

A leave-one-out sensitivity analysis was conducted within the MR framework to evaluate the influence of individual SNPs on causal estimates for benign prostatic enlargement. Each variant was sequentially excluded, and causal effects were re-estimated using the remaining instruments to identify SNPs exerting disproportionate influence. For each iteration, 95% confidence intervals were generated to assess the stability

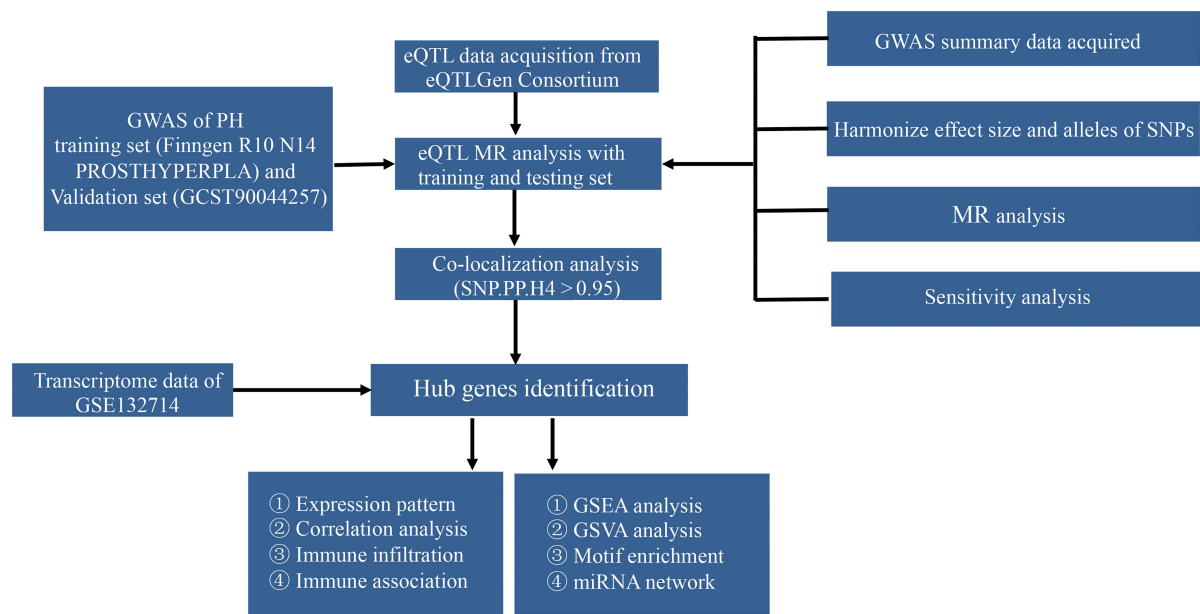


Figure 1. Flowchart of the study design. GWAS: Genome-wide association study; MR: mendelian randomization; eQTL: expression quantitative trait locus; GSEA: gene set enrichment analysis; GSVA: gene set variation analysis.

of single-variant contributions and the robustness of the overall estimate. All SNPs were retained in the final report, with key variant-level estimates presented. Comparison across iterations enabled identification of influential SNPs and confirmation of result robustness.

Colocalization analysis

Colocalization analysis was performed using the R package *coloc*, integrating whole-blood *cis*-eQTL summary statistics with GWAS summary data for BPH. Posterior probabilities were calculated within a 100-kb window centered on the index variant. In this framework, H_3 represents the posterior probability of two traits (gene expression and prostate hyperplasia) being associated with distinct causal variants, whereas H_4 represents the probability of a shared causal variant underlying both traits. A threshold of $\text{SNP.PP.H}_4 > 0.95$ was applied to define significant colocalization.

Gene set enrichment analysis

Based on the expression levels of the five candidate genes (*C2*, *GUCY1B2*, *OLFM4*, *ITPR1*, and *KLHL36*), samples were stratified into high-expression and low-expression groups for each gene. Gene set enrichment analysis (GSEA) using Kyoto Encyclopedia of Genes and Genomes (KEGG) gene sets identified significantly enriched pathways (adjusted $P < 0.05$), highlighting biological processes associated with BPH-related expression patterns.

Gene set variation analysis

Gene set variation analysis (GSVA), an unsupervised enrichment approach, was further applied to quantify pathway activity across samples using gene sets from Molecular signatures database (MSigDB) version 7.0, enabling comparison of functional differences between samples.

Immune cell infiltration analysis

Immune cell infiltration was estimated using CIBERSORT, which deconvolutes bulk transcriptomic data to infer the relative proportions of 22 immune cell subsets, including T cells, B cells, plasma cells, and myeloid lineages, based on 547 signature genes.

Regulatory network analysis of hub genes

Transcription factor prediction was performed using the R package RcisTarget, which applies motif-based enrichment analysis. The normalized enrichment score (NES) was used to quantify motif enrichment. Motif overrepresentation within gene sets was assessed using the area under the curve (AUC) derived from gene ranking recovery, and NES values were calculated from the AUC distribution across motifs.

Construction of miRNA network

miRNA-gene regulatory relationships were constructed based on experimentally or computationally predicted interactions. Candidate miRNAs targeting key genes were retrieved from miRCode, and the resulting miRNA-gene network was visualized using Cytoscape.

Statistical analysis

MR analyses rely on three core assumptions: relevance (genetic instruments are associated with the exposure), independence (instruments are not associated with confounders), and exclusion restriction (instruments influence the outcome only through the exposure). Horizontal pleiotropy arises when instruments affect the outcome through alternative pathways. All analyses were performed in R version 4.3.0 using two-tailed tests, with $P < 0.05$ considered statistically significant.

RESULTS

Mendelian randomization analysis of the training set

Druggable genes were obtained from previously published literature^[10]. To identify genes potentially associated with BPH within the druggable genome, GWAS summary statistics from the FinnGen biobank (finngen_R10_N14_PROSTHYPERPLA), comprising 32,956 cases and 130,139 controls, were analyzed. Using the IVW method as the primary MR estimator, 105 genes were identified as significantly associated with BPH in the training dataset (Figure 2, IVW $P < 0.05$). Among these, PTPN13, JAK3, KDM4C, C2, BIRC2, CD38, TGFBR1, IL1R1, RRM2B, FAM20A, XYLT1, AKR1C1, AZIN1, KBTBD7, CR1, RGS12, CD1C, IL4, ADORA3, CXCR6, LOXL3, RPS6KB2, RYR2, GNAS, CDK12, PLA2G4B, BTN3A1, MAPKAPK3, CLEC3B, CDC42, LGR6, COL6A3, VKORC1L1, AKR1C2, ULK3, CORIN, THRA, GUCY1B2, IMPA1, CA2, GPBAR1, SERPINB9, SIGLEC11, LIPN, MAPK3, APOBEC3A, IFNGR2, and SIRPB1 were associated with reduced BPH risk, whereas FPR1, FCRL5, PAM, RHD, SERPINB1, DHRS7, PRKCB, CDKL1, DHFR, SLC12A7, RIPK1, MPO, SLC22A5, OLFM4, CXCR1, SBK1, BACE1, CTSF, TMEM9B, CTSB, KLHL12, P2RY14, H3F3A, CCL3L1, CYP2U1, CD160, HLA-G, CD6, CD79B, PTK2, LAMB2, CD79A, CD68, C5, EGLN1, VEGFA, CD5, ITPR1, CRISP3, STK38, PRRT3, KLHL36, COL17A1, FCRL2, TLR6, BMP2K, CD22, MMP11, GLB1, DRD4, C5AR1, PDGFRB, AKT3, MAP3K3, FGF9, MAP4K4, and TUBB4B were associated with increased BPH risk. Leave-one-out analysis indicated that no single SNP exerted a disproportionate influence on the overall MR estimates, supporting the robustness of the training-set results.

Mendelian randomization analysis and colocalization analysis of the validation set

To validate these findings, an independent GWAS dataset from the IEU OpenGWAS database (GCST90044257), including 6,505 cases and 202,303 controls, was further analyzed using the same MR framework. Eleven genes were identified as significantly associated with BPH in the validation dataset (Figure 3, IVW $P < 0.05$). Among these, C2, KBTBD7, GUCY1B2, and EGLN1 were associated with reduced BPH risk, whereas OLFM4, H3F3A, ITPR1, KLHL36, IL4, BTN3A1, and FGF9 were associated with increased BPH risk. Leave-one-out analysis confirmed that these associations were not driven by any single instrumental SNP, supporting their stability [Figure 4]. Colocalization analysis was subsequently performed for the 11 replicated genes. Five genes - C2, GUCY1B2, OLFM4, ITPR1, and KLHL36 - showed strong evidence of colocalization ($PP.H4 > 0.95$) and were prioritized for downstream analyses [Figure 5]. To further evaluate their discriminatory performance, exploratory single-gene receiver operating characteristic (ROC) analyses were conducted using the GSE132714 dataset. GUCY1B2, ITPR1, and KLHL36 demonstrated moderate-to-good discrimination between BPH and control samples, whereas C2 and OLFM4 showed limited performance [Supplementary Table 1].

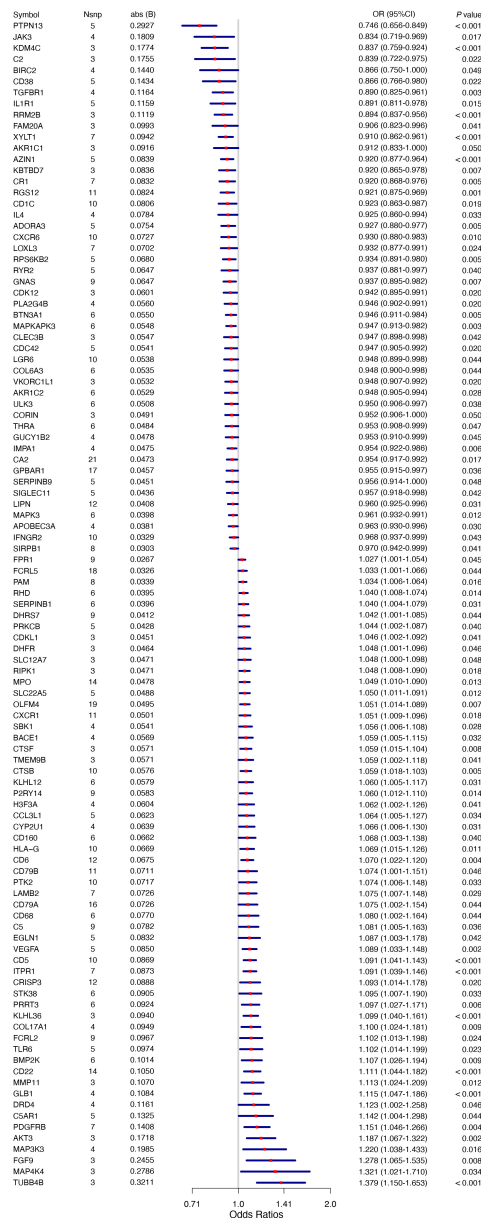


Figure 2. Mendelian randomization analysis in the training set. Mendelian randomization identified 105 causal associations between gene expression and BPH risk. BPH: Benign prostatic hyperplasia; OR: odds ratio.

GSEA

To investigate the biological functions of the five prioritized genes, GSEA was performed based on their expression profiles. C2 was mainly enriched in ribosome, pentose phosphate pathway (PPP), and fatty acid metabolism [Figure 6A]. GUCY1B2 was enriched in mechanistic target of rapamycin (mTOR), mitogen-activated protein kinase (MAPK), and Wnt signaling pathways [Figure 6B]. IITPR1 was enriched in tumor protein p53 (p53), transforming growth factor-beta (TGF- β), and tumor necrosis factor (TNF) signaling pathways [Figure 6C]. KLHL36 was enriched in Vascular endothelial growth factor (VEGF) signaling, estrogen response, and RNA degradation pathways [Figure 6D]. OLFM4 was enriched in the PPP, interleukin-17 (IL-17) signaling, and N-glycan biosynthesis [Figure 6E]. These results suggest that the five prioritized genes may contribute to BPH progression through multiple pathways involved in cell proliferation, inflammation, metabolic reprogramming, and microenvironmental remodeling.

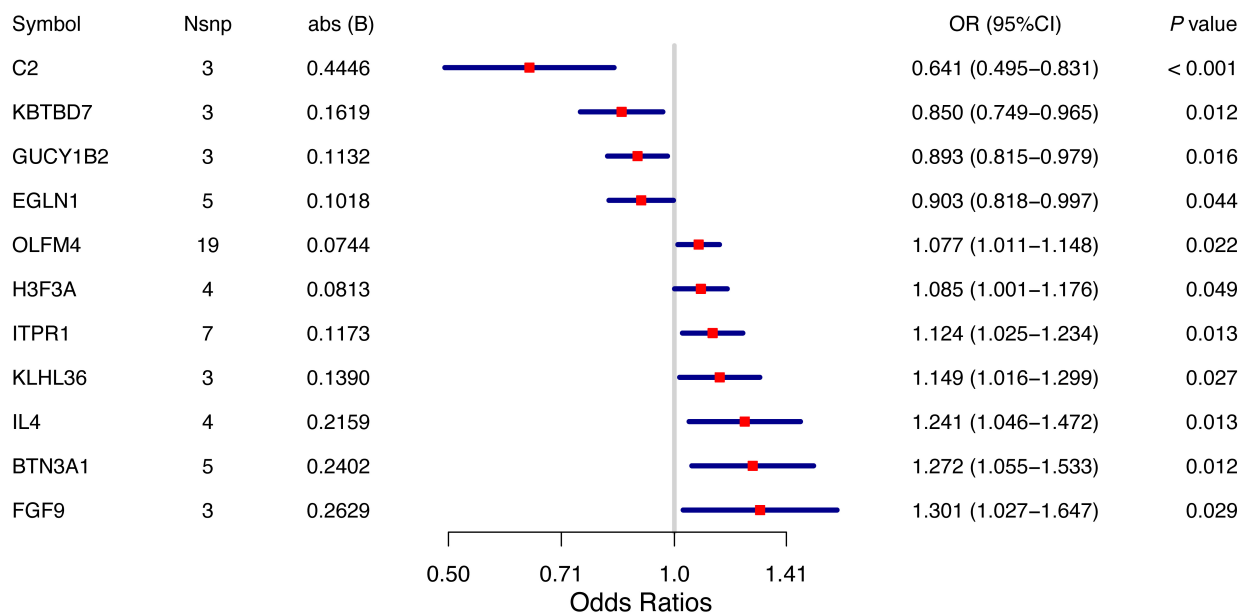


Figure 3. Mendelian randomization analysis in the validation set. The IVW method was used as the primary estimator to identify genes significantly associated with BPH in the validation dataset (IVW $P < 0.05$). MR-Egger, weighted median, and weighted mode methods were applied as complementary sensitivity analyses. BPH: Benign prostatic hyperplasia; IVW: Inverse-variance weighted; MR: mendelian randomization; OR: odds ratio.

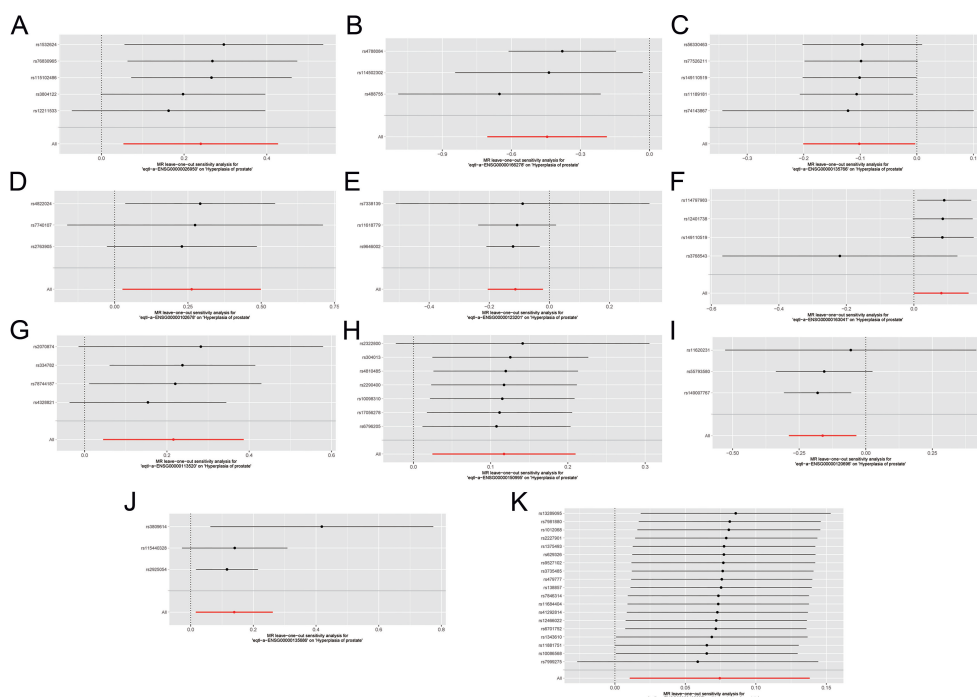


Figure 4. Leave-one-out sensitivity analysis. (A-K) Forest plots of leave-one-out analyses for SNPs corresponding to key genes. MR: Mendelian randomization; SNPs: single nucleotide polymorphisms.

GSA

GSA was performed to compare pathway activity between the high- and low-expression groups for each prioritized gene. C2 was associated with p53 signaling and related pathways [Figure 7A]. GUCY1B2 showed enrichment in reactive oxygen species signaling and interleukin-6 (IL-6)/Janus kinase (JAK)/signal

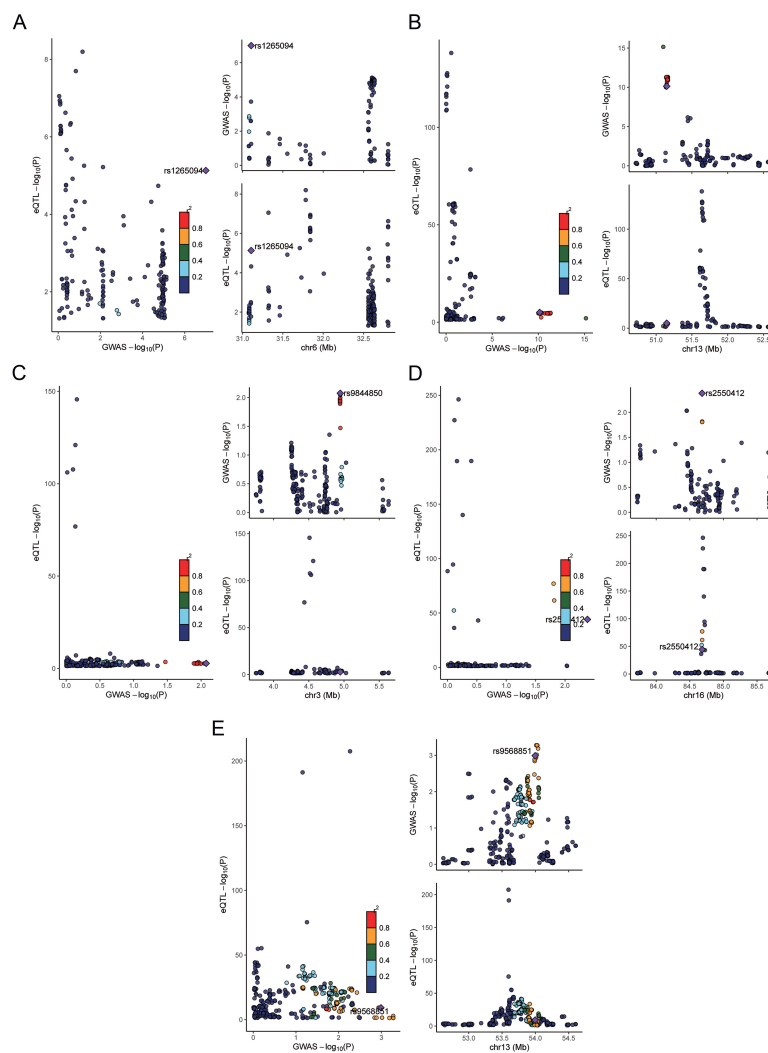


Figure 5. Colocalization analysis. (A-E) Regional association plots comparing GWAS and eQTL signals for C2, GUCY1B2, OLFM4, ITPR1, and KLHL36. Left panels display the relationship between GWAS and eQTL association signals, whereas right panels show regional association patterns across genomic coordinates. eQTL: Expression quantitative trait locus; GWAS: Genome-wide association study; C2: complement component 2; GUCY1B2: guanylate cyclase 1 soluble subunit beta 2; OLFM4: olfactomedin 4; ITPR1: inositol 1,4,5-trisphosphate receptor type 1; KLHL36: kelch like family member 36.

transducer and activator of transcription 3 (STAT3) signaling [Figure 7B]. ITPR1 was associated with IL-2/STAT5 signaling, Hedgehog signaling, and related pathways [Figure 7C]. KLHL36 was enriched in mTORC1 signaling, Notch signaling, and additional cancer-related pathways [Figure 7D]. OLFM4 was associated with phosphatidylinositol 3-kinase (PI3K)/protein kinase B (AKT)/mTOR signaling, Wnt/ β -catenin signaling, and other proliferation-related pathways [Figure 7E]. Overall, GSA results further supported the involvement of these genes in key biological processes relevant to BPH.

Immune infiltration analysis

To characterize the immune microenvironment associated with BPH, CIBERSORT was applied to estimate the relative proportions of 22 immune cell types. The overall immune landscape is presented in Figure 8A, and correlations among immune cell subsets are shown in Figure 8B. Comparative analysis between control and BPH groups revealed significant differences in specific immune cell populations, particularly natural killer (NK) cells and plasma cells [Figure 8C], suggesting that altered immune infiltration may contribute to BPH pathophysiology.

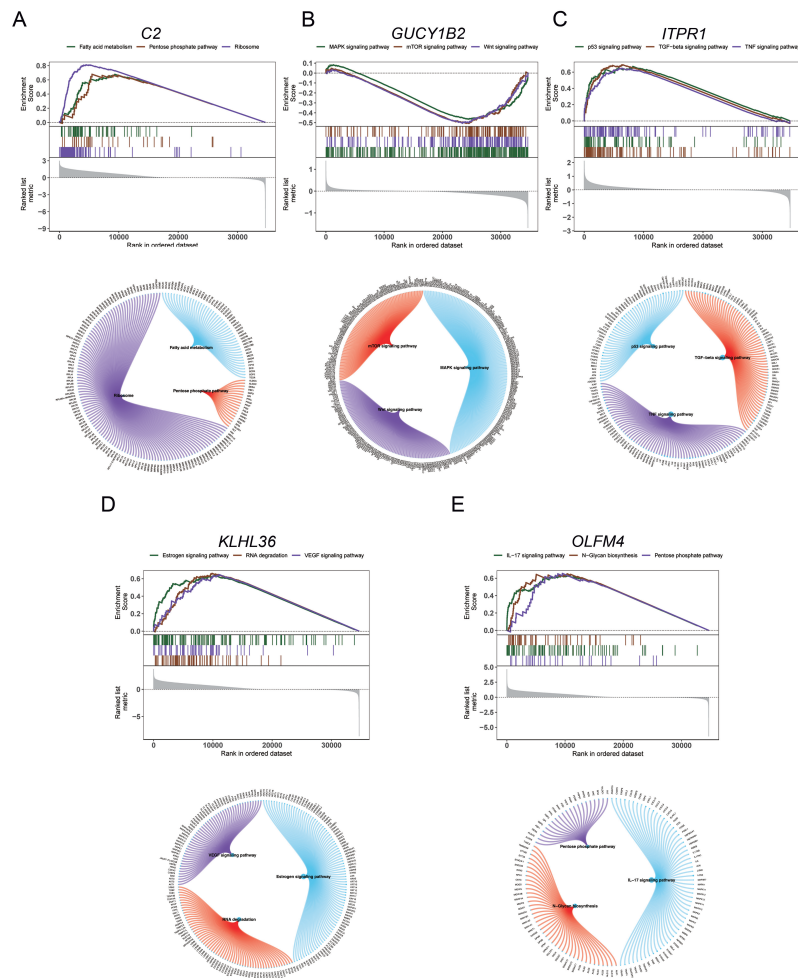


Figure 6. GSEA of key genes. (A-E) KEGG pathway enrichment analysis of key genes, including associated signaling pathways and contributing genes. GSEA: Gene set enrichment analysis; C2: complement component 2; GUCY1B2: guanylate cyclase 1 soluble subunit beta 2; OLFM4: olfactomedin 4; ITPR1: inositol 1,4,5-trisphosphate receptor type 1; KLHL36: kelch like family member 36; KEGG: kyoto encyclopedia of genes and genomes; mTOR: mechanistic target of rapamycin; MAPK: mitogen-activated protein kinase; TNF: tumor necrosis factor; TGF: transforming growth factor; IL-17: interleukin-17.

The relationship between key genes, immune cells, and immune factors

Associations between the five prioritized genes and immune cell infiltration were further evaluated. Significant correlations were observed across multiple immune cell subsets [Figure 8D]. Notably, C2 showed a strong association with M1 macrophages, whereas GUCY1B2, KLHL36, and OLFM4 were also linked to several immune cell populations, indicating potential interactions between these genes and the immune microenvironment in BPH. In addition, the Tumor and Immune System Interaction Database (TISIDB) was used to assess the relationships between the prioritized genes and immune-related factors, including chemokines, immune inhibitors, immune stimulators, major histocompatibility complex (MHC) molecules, and receptors [Figure 9]. Collectively, these results suggest that the prioritized genes may contribute to BPH progression through immune-related regulatory mechanisms.

Transcriptional regulation and miRNA network related to key genes

To further explore upstream regulatory mechanisms, transcription factor enrichment analysis was performed using RcisTarget. Coordinated regulation of the five genes by multiple transcription factors was observed, and significantly enriched motifs and corresponding transcription factors are presented in Figure 10A and B. Among them, nuclear factor kappa B subunit 1 (NFKB1) exhibited the highest normalized enrichment score

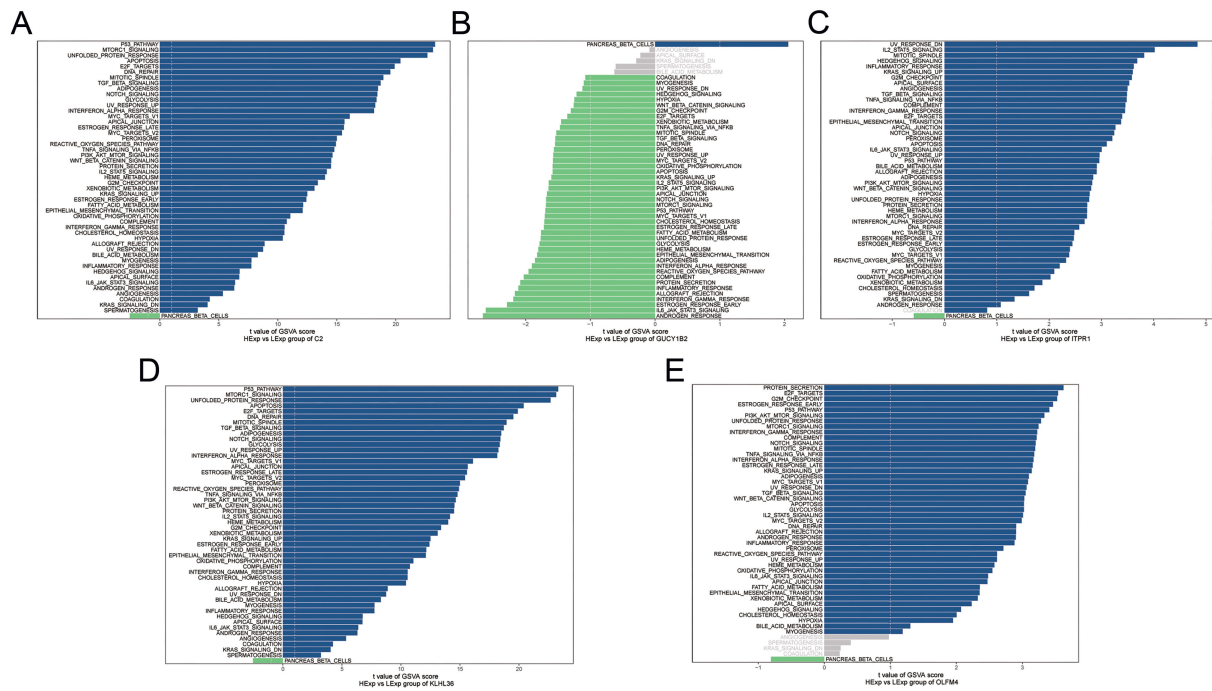


Figure 7. GSVA of key genes. (A-E) GSVA results for key genes. Blue indicates pathways enriched in the high-expression group, whereas green indicates pathways enriched in the low-expression group. Hallmark gene sets were used as the reference. C2: complement component 2; GUCY1B2: guanylate cyclase 1 soluble subunit beta 2; OLFM4: olfactomedin 4; ITPR1: inositol 1,4,5-trisphosphate receptor type 1; KLHL36: kelch like family member 36; GSVA: gene set variation analysis.

(NES) (6.3), followed by *RELA* proto-oncogene, NF-kappa B subunit (*RELA*) (NES = 5.67), suggesting that inflammatory transcriptional programs may be involved in regulating these genes. A miRNA-mRNA regulatory network was also constructed using the miRCode database (<https://mirdb.org/>). A total of 81 candidate miRNAs targeting the five prioritized genes were identified, generating 183 miRNA-mRNA interaction pairs [Figure 10C]. These results indicate that the prioritized genes may be regulated through both transcription factor- and miRNA-mediated mechanisms.

Correlation between key genes, metabolic pathways, and disease progression genes

Associations between the prioritized genes and metabolic pathways were further investigated. Heatmap analysis indicated that these genes were linked to multiple metabolic processes, including amino acid metabolism, lipid metabolism, drug metabolism, and other progression-related pathways [Figure 11A]. BPH-related genes were subsequently retrieved from the GeneCards database, and the top 20 candidates were selected for comparison of expression levels between control and BPH groups. Among these, *AKT1*, *BRCA2*, *CDH1*, *GNAS*, *KLK3*, *POR*, and *STAR* exhibited significant differential expression [Figure 11B]. Correlation analysis further revealed close associations between the prioritized genes and established disease-related genes [Figure 11C]. Notably, C2 showed a significant negative correlation with *CYP11B1* (Pearson's $r = -0.539$), whereas *KLHL36* displayed a strong positive correlation with *GNAS* (Pearson's $r = 0.874$). These results further support the involvement of the prioritized genes in metabolic alterations and disease progression in BPH.

DISCUSSION

BPH is a common age-related disorder that primarily affects older men^[11]. Its pathogenesis is multifactorial and is influenced by age-associated metabolic dysregulation, hormonal imbalance, and chronic inflammation. BPH can be chronic and debilitating when inadequately managed, substantially impairing

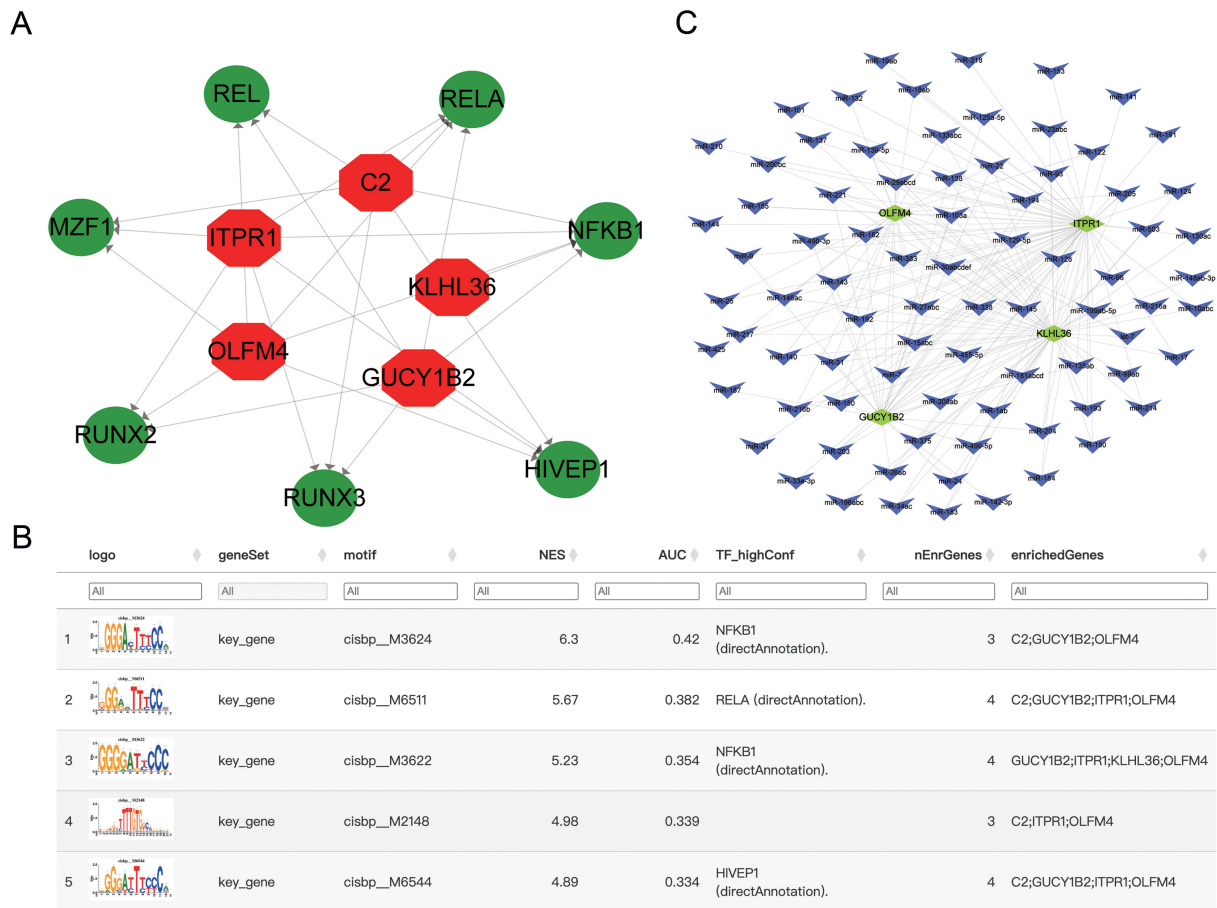


Figure 10. Transcriptional and miRNA regulatory networks associated with key genes. (A) Transcriptional regulatory network (red: key genes; green: transcription factors); (B) Enriched motifs and corresponding transcription factors; (C) miRNA-gene interaction network (yellow: mRNA; blue: miRNA). C2: Complement component 2; GUCY1B2: guanylate cyclase 1 soluble subunit beta 2; OLFM4: olfactomedin 4; ITPR1: inositol 1,4,5-trisphosphate receptor type 1; KLHL36: kelch like family member 36; REL: REL proto-oncogene, NF-kB subunit; MZF1: Myeloid zinc finger 1; RUNX2: RUNX family transcription factor 2; RUNX3: RUNX family transcription factor 3; HIVEP1: HIVEP zinc finger 1; NFKB1: nuclear factor kappa B subunit 1; RELA: RELA proto-oncogene, NF-kB subunit.

as captopril and cetorelix have been shown to upregulate p53 expression in experimental models, thereby attenuating androgen receptor-induced prostatic hyperplasia. Accordingly, C2 may contribute to delayed BPH progression through modulation of p53 pathway activity.

GUCY1B2 is regarded as a frameshift-mutated pseudogene that does not encode a functional protein^[19]. Nevertheless, it may still have regulatory relevance in certain human biological processes. Functional enrichment analysis indicated that *GUCY1B2* is associated with mTOR, MAPK, and Wnt signaling pathways. Accumulating evidence suggests that AKT/mTOR signaling promotes stromal cell proliferation in BPH^[20,21]. Activation of the AKT pathway disrupts the Bax/Bcl-2 balance in prostatic cell lines, thereby suppressing apoptosis in prostate cells^[22]. Conversely, inhibition of the AKT/mTOR pathway attenuates cell proliferation and inflammatory responses^[23,24]. In addition, the p38/MAPK pathway regulates FOXO3a activity, thereby inhibiting apoptosis and reactive oxygen species accumulation in BPH-1 epithelial cells^[25]. Increased expression of Wnt/ β -catenin and cyclin D1 has been observed in BPH specimens, indicating that activation of Wnt/ β -catenin signaling is associated with disease progression. Inhibition of this pathway has been shown to alleviate BPH progression *in vivo* and *in vitro* by inducing apoptosis, causing G0/G1 cell cycle arrest, reducing tissue fibrosis, and suppressing epithelial-mesenchymal transition (EMT)^[26]. These findings suggest that *GUCY1B2* may attenuate BPH progression through modulation of the mTOR, MAPK, and Wnt signaling pathways.

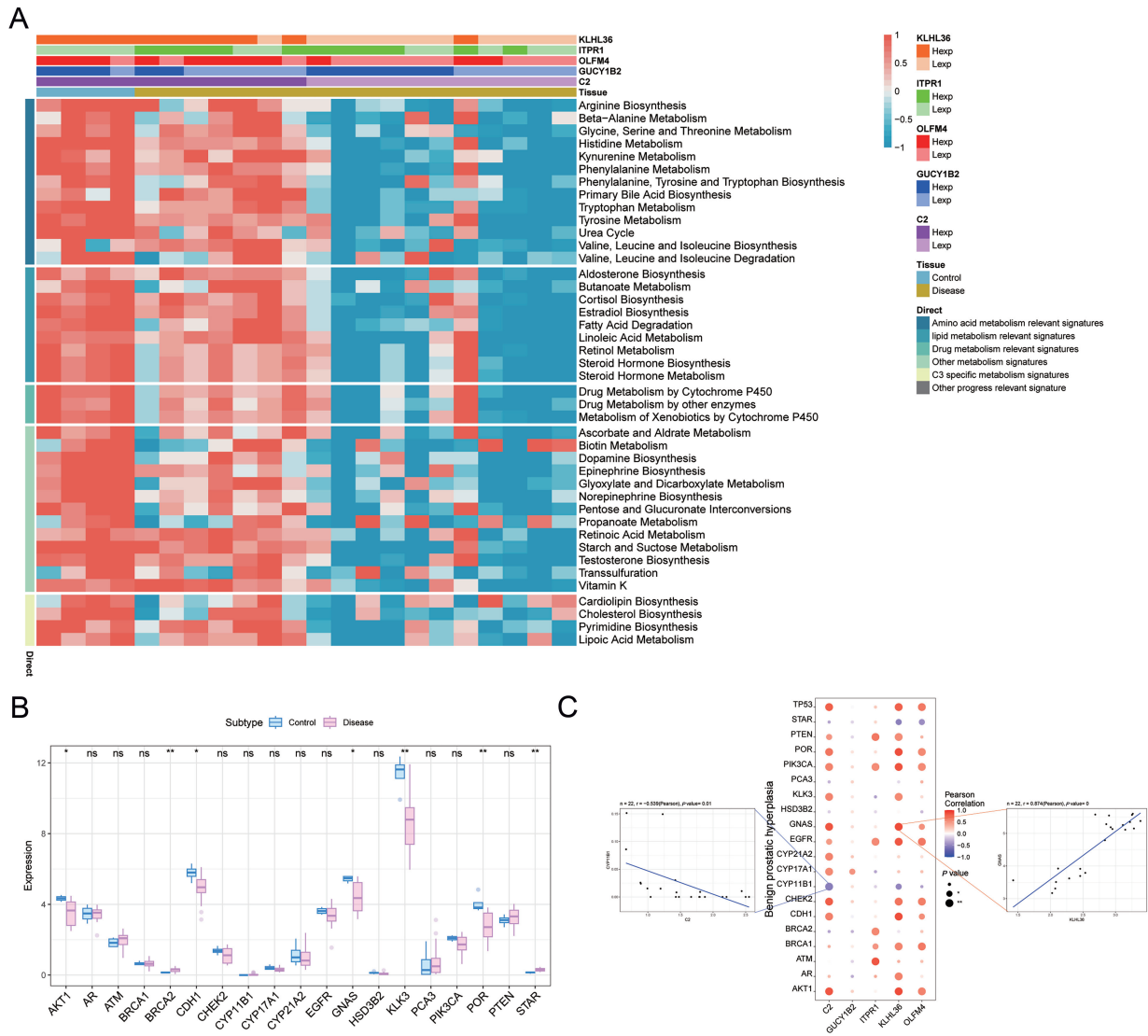


Figure 11. Correlations between key genes, representative pathways, and disease-related genes. (A) Heatmap of correlations between prioritized genes and representative metabolic pathways; blue indicates lower values and red indicates higher values; (B) Differential expression of representative BPH-related genes between control and BPH samples; blue represents controls and pink represents patients; (C) Correlation analysis between prioritized genes and representative BPH-related genes. The central bubble plot shows Pearson correlation coefficients, with color indicating direction and magnitude and dot size reflecting statistical significance. The left and right scatter plots illustrate representative correlations for C2 versus CYP11B1 and KLHL36 versus GNAS, respectively. BPH: Benign prostatic hyperplasia; C2: Complement component 2; GUCY1B2: guanylate cyclase 1 soluble subunit beta 2; OLFM4: olfactomedin 4; ITPR1: inositol 1,4,5-trisphosphate receptor type 1; KLHL36: kelch like family member 36; GNAS: GNAS complex locus.

ITPR1-related expression patterns were enriched in the p53, TGF- β , and TNF signaling pathways. In addition, inflammatory cell infiltration within the BPH microenvironment is associated with elevated levels of growth factors and proinflammatory cytokines^[27]. Notably, TGF- β 1 is predominantly secreted by Leydig cells into the prostatic stromal microenvironment, promoting both epithelial and stromal cell differentiation^[28]. Inhibition of TGF- β 1/Smad signaling has been shown to suppress BPH progression and EMT in BPH-1 cells^[29]. EMT contributes to excessive accumulation of myofibroblasts and extracellular matrix deposition in the prostate, resulting in increased tissue stiffness, reduced urethral compliance, and exacerbation of LUTS. Vickman *et al.* demonstrated that TNF- α antagonism alters BPH pathogenesis and significantly reduces disease incidence^[30]. *ITPR1* may regulate intracellular Ca²⁺ signaling and thereby influence multiple pathways, including mTOR, MAPK, and Wnt signaling, as well as TNF- α - and TGF- β

1-mediated inflammatory responses. Accordingly, *ITPR1* may play a pivotal role in BPH development, and its targeting, along with associated pathways, may represent a potential therapeutic strategy.

KLHL36 is enriched in VEGF, estrogen response, and RNA degradation pathways. VEGF is markedly overexpressed in BPH tissues and plays a central role in disease initiation and progression^[31-33]. Inhibition of vascular endothelial growth factor receptor 2 (VEGFR-2) signaling and endothelial tube formation has been shown to effectively suppress prostate tissue growth and neovascularization^[34]. Abdel-Aziz *et al.* demonstrated that febuxostat attenuates testosterone-induced BPH in rats through suppression of inducible nitric oxide synthase (iNOS)/cyclooxygenase-2 (COX-2) and VEGF/TGF- β signaling pathways^[35]. Trujillo-Rojas *et al.* further suggested that BPH development may be associated with altered expression profiles of prostate chemokines, particularly VEGF^[36]. Although the prostate is classically regarded as an androgen-dependent organ, androgen signaling alone is insufficient to fully account for disease progression. Estrogen-related pathways also contribute to BPH pathogenesis. Recent evidence indicates that G protein-coupled estrogen receptor (GPER)-mediated signaling regulates epithelial proliferation and survival in BPH^[37], while estradiol promotes EMT in benign prostatic epithelial cells^[38]. More broadly, estrogen signaling and the androgen-to-estrogen balance shift have been implicated in tissue remodeling, LUTS development, and BPH progression^[39-41]. Collectively, *KLHL36* may contribute to BPH pathogenesis through regulation of angiogenesis, epithelial proliferation, and extracellular matrix remodeling.

OLFM4 is enriched in the PPP, IL-17 signaling, and N-glycan biosynthesis pathways. *OLFM4* is known to regulate cell adhesion and migration through interactions with adhesion molecules, cytoskeletal components, and the extracellular matrix^[42]. By modulating the PPP, *OLFM4* may support proliferative demands and enhance antioxidant capacity, thereby facilitating BPH progression. Emerging evidence suggests that stromal proliferation in BPH can occur in an androgen-independent manner and is closely linked to microenvironmental remodeling^[43]. In addition, IL-17 levels are elevated in patients with BPH and correlate with prostate volume^[44,45]. IL-17 signaling can also activate the TGF- β 1/ERK pathway. *OLFM4* may amplify these effects by modulating extracellular matrix dynamics and cell adhesion, thereby promoting fibrosis and glandular hyperplasia and contributing to BPH progression.

Inflammation plays a central role in the initiation and progression of BPH by driving persistent tissue injury, dysregulated repair, and chronic immune activation. This process involves repeated tissue damage, aberrant wound healing, immune dysregulation, and interaction with androgen signaling. Immune infiltration was evaluated using the CIBERSORT algorithm, which deconvolutes bulk transcriptomic data to estimate the relative proportions of 22 immune cell subsets. Correlation analyses were then performed to assess associations between gene expression and inferred immune cell fractions. Significant differences were observed in NK cells and plasma cells between patient groups [Figure 8C]. NK cells are critical mediators of immune surveillance and cytotoxic responses, contributing to the elimination of abnormal cells; however, excessive activation may exacerbate local inflammation and promote prostatic hyperplasia and tissue remodeling. Plasma cells may contribute to chronic inflammatory maintenance and tissue repair through antibody production and immunomodulatory functions. Further investigation is required to clarify the immune regulatory mechanisms underlying BPH progression.

Finally, associations between the prioritized genes and metabolic pathways were examined [Figure 11A]. Distinct genes showed differential involvement in amino acid metabolism and lipid metabolism pathways, with additional associations to disease status through other metabolic and signaling routes. In addition, expression analyses of BPH-related genes revealed consistent correlations between the prioritized genes and established disease-associated genes, further supporting their potential involvement in the pathological mechanisms of BPH.

Although integrative analyses consistently prioritized C2, GUCY1B2, OLFM4, ITPR1, and KLHL36 as candidate BPH-associated genes, the present study is primarily computational and hypothesis-generating. Accordingly, interpretation of their biological roles should remain cautious pending experimental validation. Future studies are warranted to characterize their expression patterns and functional roles in BPH tissues, cellular systems, and animal models. In particular, quantitative polymerase chain reaction (PCR), immunohistochemistry, loss- and gain-of-function assays, and pathway perturbation experiments may clarify whether these genes directly regulate epithelial proliferation, stromal remodeling, inflammation, or other pathogenic processes in BPH.

Motif-based transcription factor enrichment analysis suggested that NFKB1 and RELA may serve as key upstream regulators of the identified genes, indicating that inflammatory transcriptional programs may contribute to BPH pathogenesis. In addition, 81 miRNAs targeting the five key genes were identified, forming 183 miRNA-mRNA interaction pairs. These results support a complex multilayer regulatory network underlying BPH progression and provide candidate regulatory molecules for future experimental validation. From a translational perspective, the prioritized genes may have potential value in BPH stratification and target discovery. In particular, C2 and OLFM4 may represent promising biomarker or intervention candidates due to their consistent prioritization across genetic analyses and their involvement in inflammation-, metabolism-, and microenvironment-related pathways. Although further validation is required, these findings provide a basis for translating genetic prioritization into clinically relevant biomarker panels and mechanism-informed therapeutic strategies for BPH.

Limitations

This study has several limitations. First, eQTL data were derived from whole-blood samples rather than prostate tissue, which may not fully capture regulatory mechanisms in prostatic epithelial or stromal compartments. Second, both discovery and validation GWAS datasets were restricted to individuals of European ancestry, limiting generalizability to other populations. Third, despite supportive colocalization results for the five key genes, residual bias from horizontal pleiotropy or linkage disequilibrium cannot be fully excluded. Fourth, functional interpretations of C2, GUCY1B2, OLFM4, ITPR1, and KLHL36 were based primarily on bioinformatic inference and require experimental validation in relevant BPH models. Finally, the relatively small sample size of the GEO dataset may limit statistical power in exploratory transcriptomic analyses.

Conclusion

In conclusion, five candidate genes associated with BPH - C2, GUCY1B2, OLFM4, ITPR1, and KLHL36 - were identified through eQTL-based MR and colocalization analyses. Integrated downstream analyses suggested that these genes may contribute to BPH pathogenesis through coordinated regulation of signaling pathways, immune microenvironment interactions, transcriptional networks, miRNA-mediated regulation, and metabolic reprogramming. Among them, C2 and OLFM4 may represent promising candidates for future biomarker development and mechanism-based therapeutic strategies, although further experimental and clinical validation remains essential. These findings may also support future efforts toward genetically informed stratification and precision medicine approaches in BPH.

DECLARATIONS

Authors' contributions

Conceived the study: Yao X, Guo Y, Zhang Y, Song W

Drafted the manuscript: Gu Z

Prepared the figures: Pan X, Huang D

Interpreted the data: Ni P

Polished the article: Zou L

Collected the references: Zhang Y

Participated in the discussion and gave constructive comments: Chen Y
All authors have read and agreed to the published version of the manuscript.

Availability of data and materials

The datasets analyzed in this study are publicly available from the eQTLGen Consortium, FinnGen, the IEU OpenGWAS database, and the Gene Expression Omnibus (GEO) under accession number GSE132714.

AI and AI-assisted tools statement

During the preparation of this manuscript, the AI tool ChatGPT (version GPT-5.4, released 2025-03-05) was used solely for language editing. The tool did not influence the study design, data collection, analysis, interpretation, or the scientific content of the work. All authors take full responsibility for the accuracy, integrity, and final content of the manuscript.

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Conflicts of interest

All authors declared that there are no conflicts of interest.

Ethical approval and consent to participate

This study was based exclusively on publicly available summary-level datasets from eQTLGen, FinnGen, IEU OpenGWAS, and GEO (GSE132714). No new human participants, human samples, or animal experiments were involved; therefore, additional ethical approval and informed consent were not required.

Consent for publication

Not applicable.

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Supplementary Materials

[Supplementary Materials](#)

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