

# Genome-wide linkage and association study identifies novel genes and pathways implicated in polycystic ovarian syndrome

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**Abstract. – OBJECTIVE:** Polycystic ovarian syndrome (PCOS) is a complex heterogeneous condition that affects women of reproductive age, conferring increased cardiovascular morbidity and mortality. The syndrome is characterized by oligomenorrhea, hyperandrogenism, and/or polycystic ovaries and is often associated with obesity and type 2 diabetes. Individuals are predisposed to PCOS by environmental factors and risk variants in genes mostly involved in ovarian steroidogenesis and/or insulin resistance. Genetic risk factors have been identified by both familial and genome-wide (GW) association studies. However, most genetic components are still unknown and missing heritability needs to be elucidated. To learn more about the genetic determinants of PCOS, we performed a GW study in genetically highly homogeneous peninsular families.

**PATIENTS AND METHODS:** We conducted the first GW-linkage and linkage disequilibrium (i.e., linkage + association) study in Italian families with PCOS.

**RESULTS:** We identified several novel risk variants, genes, and pathways potentially implicated in the pathogenesis of PCOS. Specifically, we detected 79 novel variants with significant GW-linkage and/or -association with PCOS across 4 inheritance models ( $p < 0.00005$ ), of which 50 variants were within 45 novel PCOS-risk genes.

**CONCLUSIONS:** This is the first GW-linkage and linkage disequilibrium study performed in peninsular Italian families and reporting novel genes in PCOS.

*Key Words:*

Polycystic ovary syndrome, Pathways, Gene, Variant, Risk, Linkage, Parametric analysis, Linkage disequilibrium, Association, Cortisol, Metabolic, Insulin resistance, Obesity, Type 2 diabetes, Families, Familial, Ita-

ly, Italian, Single nucleotide polymorphisms, SNP, Hyperandrogenism, Hyperandrogenemia, Irregular menses, Cycles, Amenorrhea, Oligomenorrhea, Anovulation, Subfertility, Infertility, Folliculogenesis, Follicle maturation, Fat metabolism, Ethnic group, inflammation, Cardiovascular morbidity, Mortality, PPP1, Protein phosphatase 1, PPP1R12B, Protein phosphatase 1 regulatory subunit 12B, NEGR1, Neuronal growth regulator 1, SESTD1, SEC14 And spectrin domain containing 1, ATL2, Atlantin GTPase 2, C10TNF7, C1q and TNF related 7, PROM1, Prominin 1, FGF1, Fibroblast growth factor 1, LMBR1, Limb development membrane protein 1, DGKB, Diacylglycerol kinase beta, LINC02476, Long intergenic non-protein coding RNA 2476, PTK2B, Protein tyrosine kinase 2 beta, MLLT3, MLLT3 Super elongation complex subunit, KCNT1, Potassium sodium-activated channel subfamily T member 1, ADAM12, ADAM metallopeptidase domain 12, HK1, hexokinase 1, CASP5, Caspase 5, CDCA5, Cell division cycle associated 5, SPPL3, Signal peptide peptidase like 3, PCDH9, Protocadherin 9, DCAF4, DDB1 and CUL4 associated factor 4, TPM1, Tropomyosin 1, CFAP52, Cilia and flagella associated protein 52, CDH7, Cadherin 7, PTPRM, Protein tyrosine phosphatase receptor type M, LRRC74B, Leucine rich repeat containing 74B, bHLH2, Basic helix-loop-helix transcription factor, CCDC54, Coiled-coil domain containing 54, PDZD2, PDZ domain containing 2, FARS2, Phenylalanyl-tRNA synthetase 2, Mitochondrial, CHRNB3, Cholinergic receptor nicotinic beta 3 subunit, BEND7, BEN domain containing 7, LAMTOR1, Late endosomal/lysosomal adaptor, MAPK and MTOR activator 1, LRTOMT, Leucine rich transmembrane and O-methyltransferase domain containing, B3GAT1-DT, B3GAT1 divergent transcript, MYCBP2, MYC binding protein 2, LINC02341, Long intergenic non-protein coding RNA 2341, UNC13C, unc-13 homolog C, PLA2G4E, Phospholipase A2 group IVE, ALOX12P2, Arachidonate 12-lipoxygenase pseudogene 2, CACNG5, Calcium voltage-gated channel auxiliary subunit gamma 5.

## Introduction

Polycystic ovarian syndrome (PCOS) is a common condition affecting up to 10% of worldwide women who present with two of three of the following: oligo- and/or anovulation, clinical and/or biochemical signs of hyperandrogenism, and polycystic ovaries<sup>1</sup>. Psychological aspects include sexual dysfunction, depression, anxiety, and decreased self-esteem and quality of life<sup>2,3</sup>.

Hyperandrogenism is a characteristic feature of PCOS, and it is aggravated by metabolic and immune impairments associated with PCOS manifestation and exacerbation<sup>4</sup>. These include a pro-inflammatory state, impaired glucose metabolism, insulin resistance (IR)<sup>5,6</sup>, obesity, and type 2 diabetes (T2D)<sup>7,8</sup>. IR and low-grade chronic inflammation underlie PCOS phenotypes and traits<sup>4</sup>, such as obesity<sup>9</sup>, elevated circulating androgens<sup>10</sup> and hyperandrogenic anovulation<sup>10,11</sup>. Insulin-sensitizing treatments, namely metformin, diet, and exercise, improve PCOS symptomatology, contribute to ovulation resumption, and reduce inflammatory markers<sup>12-15</sup>.

Several genetic, epigenetic, and environmental risk factors have been associated with the risk of PCOS<sup>16-18</sup>. A Dutch twin study demonstrated the genetic component of PCOS<sup>19</sup>. Two GWAS studies performed in Han Chinese women with PCOS identified 11 susceptibility loci<sup>20,21</sup>. Due to the vulnerability of the case-control design to population admixture, causing false-positive results, a Chinese family-based study of 321 trios (parents and PCOS-affected proband) was performed using the transmission disequilibrium test (TDT) for 10 previously detected GWAS signals: significant allelic transmission differences were found at rs2349415 (*FSHR* gene,  $p=0.0001$ ) and rs3802457 (*C9orf3* gene,  $p=0.0001$ )<sup>22</sup>. Several PCOS-risk variants are in genes involved in ovarian steroidogenesis, such as *CYP11A*, *CYP17*, and *CYP19*<sup>23</sup>, or hormonal folliculogenesis, such as *AMH*<sup>4</sup>. Other genetic risk factors have been identified within the insulin-signaling pathway (e.g., insulin receptor, insulin receptor substrate-1)<sup>25-28</sup>. Most genes and genes' variants conferring risk for PCOS are, however, still unknown. To detect novel risk variants, genes, and pathways potentially implicated in the pathogenesis of PCOS, we conducted the first GW-linkage and -association study in peninsular Italian families with PCOS. This is, therefore, the second familial study in PCOS, but, to the best of our knowledge, the first GW-linkage and linkage disequilibrium study in-

cluding families and affected sib-pairs, and the first PCOS GW study performed in a genetically homogenous peninsular population with an increased detection power.

## Patients and Methods

We studied a cohort of 212 families originating from the Italian peninsula with multigenerational cases of type 2 diabetes and diagnosed for PCOS according to the Rotterdam diagnostic criteria (presence of at least two of the following three characteristics: chronic anovulation or oligomenorrhea, clinical or biological hyperandrogenism, and/or polycystic ovaries)<sup>29</sup>. Subjects were Italian from at least 3 generations. We excluded subjects with uncertain paternity or identical twins. We used familial GW-data, derived from the UK Biobank Axiom Array platform, which had passed stringent quality control (QC,  $\geq 0.96$ ) and random genomic replication checks and kinship correlation verification. PLINK tool was used to exclude Mendelian and genotyping errors<sup>30,31</sup>. The study was conducted following the Helsinki declaration guidelines and approved by the Bios Ethical Committee. Informed written consent was obtained from each participant before the start of the study.

### *In Silico Analysis*

We analyzed the GW-significant variants with *in silico* tools that predict the pathogenicity of nonsynonymous variants with Sorting Intolerant From Tolerant (SIFT)<sup>32</sup>, Polymorphism Phenotyping v2<sup>33</sup> (PolyPhen-2), and MutationTaster<sup>34</sup>. The non-coding variants were analysed using tools that predict splicing (SpliceAI)<sup>35</sup>, transcription-factor (TF) binding (SNP Function Prediction)<sup>36</sup>, regulatory potential (RegulomeDB)<sup>37</sup>, and miRNA binding (mirSNP)<sup>38</sup>. To investigate genes-related pathways, we analyzed gene sets using PANTHER<sup>39</sup>.

### *Statistical Analysis*

The PCOS-related informatic genetic variants ( $\geq 600$  k) were tested for parametric linkage to and/or linkage disequilibrium (LD, linkage + association) with PCOS via the dominant models with complete (D1) and incomplete penetrance (D2) and the recessive models with complete penetrance (R1) and incomplete penetrance (R2), using Pseudomarker<sup>31</sup>. Variants with  $p < 0.00005$  were considered statistically significant at GW-significance level.

## Results

We detected a total of 79 novel variants significantly GW-linked and/or -associated with PCOS across the 4 inheritance models (26/D1, 20/D2, 44/R1 and 13/R2) ( $p < 0.00005$ ) (Figures 1-5). Fifty (63%) variants were located within 45 novel PCOS-risk genes (8 of which encode non-coding RNAs) (Table I). The most significantly associated risk variant was rs75798356 ( $p < 0.000001$ , R1), which is an intronic SNP lying within the gene named myeloid/lymphoid or mixed-lineage leukemia translocated to chromosome 3 protein (MLLT3) super elongation complex subunit (*MLLT3*). The results are detailed in Table I.

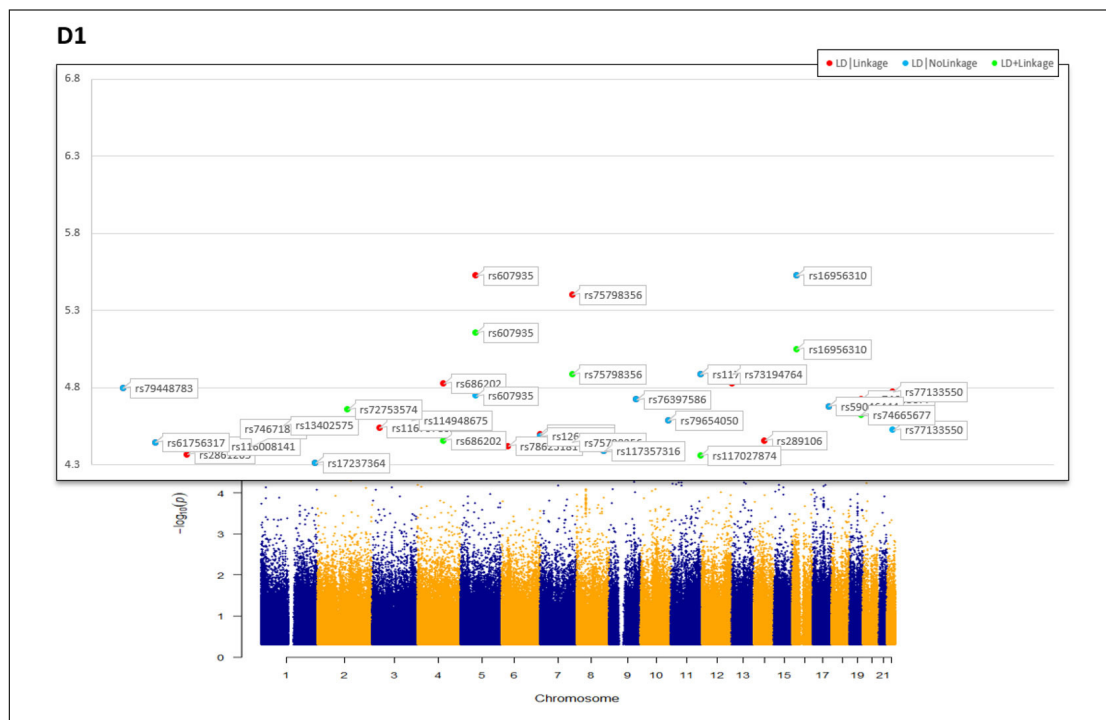
### In Silico Findings

We found that the variant rs7486605, which is located in the signal peptide peptidase like 3 (*SPPL3*) gene, affects the binding of the neuronal specific basic helix-loop-helix 1 (bHLH1) TF, which belongs to a family of TFs involved in neural growth and development<sup>40</sup>. Furthermore, the 3'-UTR variant rs2240688, located in the prominin 1 (*PROM1*) gene, creates a new binding site for the miRNA hsa-miR-135a.

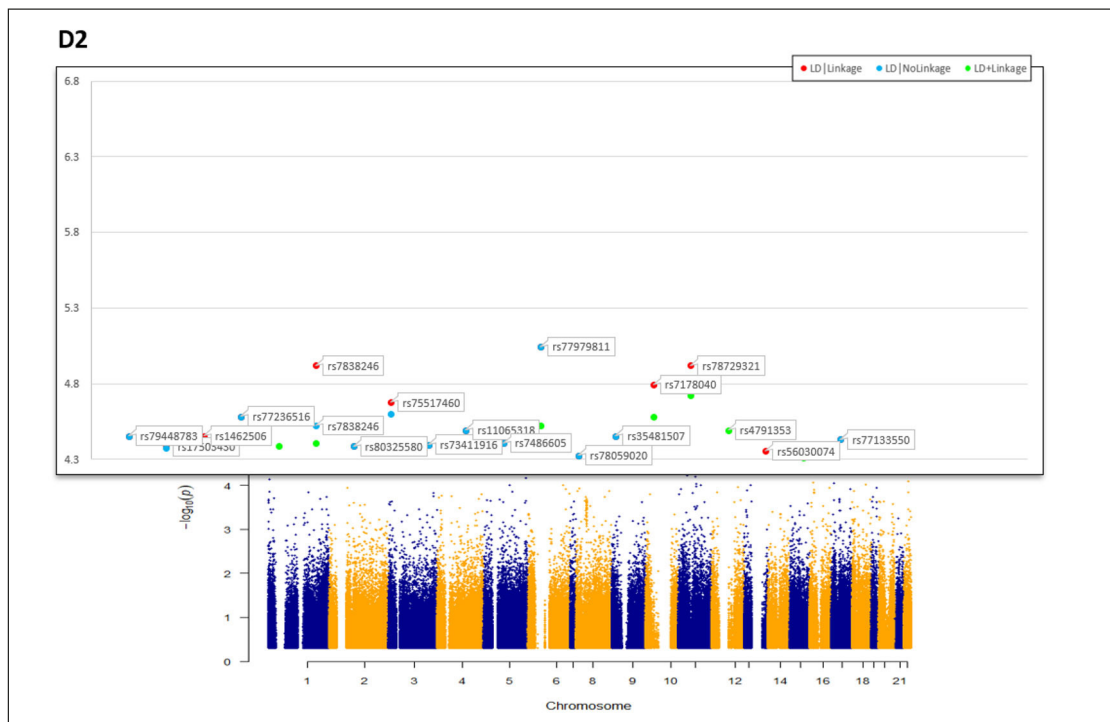
The GW-significant genes detected in our study were involved in 15 sets of pathways: 1. Wingless-related integration site (Wnt)-signaling pathway (11%); 2. Cadherin-signaling pathway (11%); 3. Fructose-galactose metabolism (6%); 4. Glycolysis (6%); 5. Pentose-phosphate pathway (6%); 6. Angiogenesis (6%); 7. Fibroblast-growth factor (FGF) signaling pathway (6%); 8. Cholecystokinin-receptor (CCKR) signaling map (6%); 9. Gonadotropin-releasing hormone receptor (GnRHR) pathway (6%); 10. Inflammation mediated by chemokine- and cytokine-signaling pathway (6%); 11. Ionotropic glutamate-receptor pathway (6%); 12. Nicotine-pharmacodynamics pathway (6%); 13. Nicotinic acetylcholine-receptor signaling pathway (6%); 14. Synaptic vesicle trafficking (6%) and, 15. Integrin-signaling pathway (6%) (Figure 5).

## Discussion

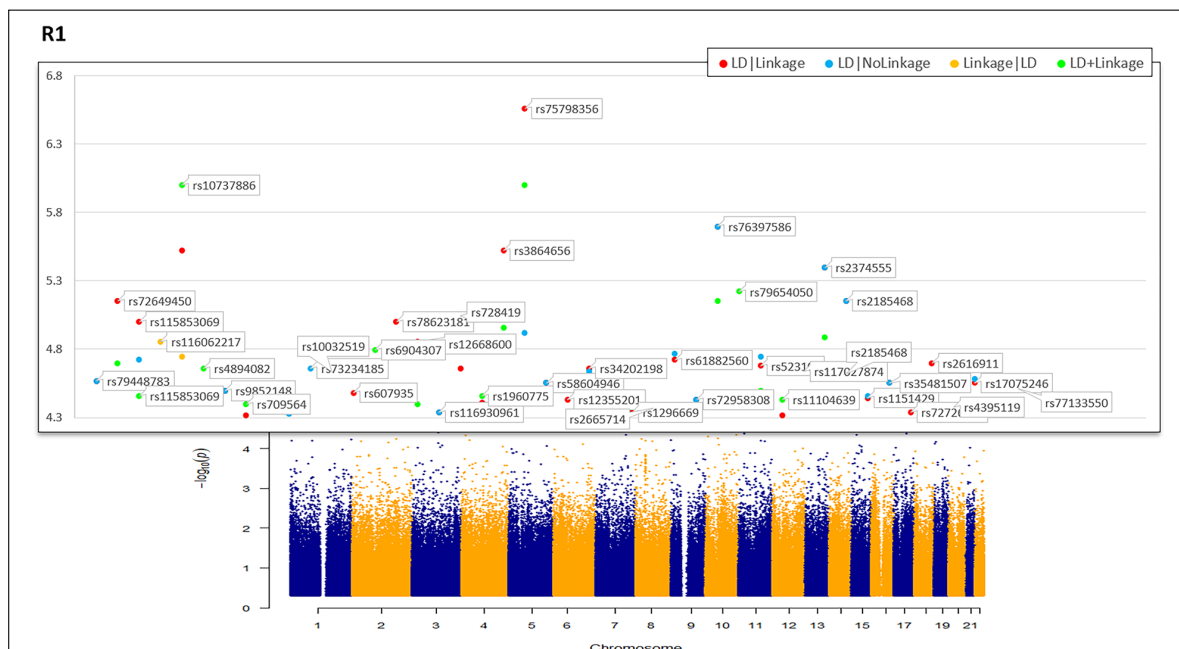
PCOS is a complexly inherited condition predisposed by environmental factors and genetic risk variants<sup>18</sup> in genes mostly involved in ovarian steroidogenesis and/or insulin resistance<sup>23,25-28</sup>. In this



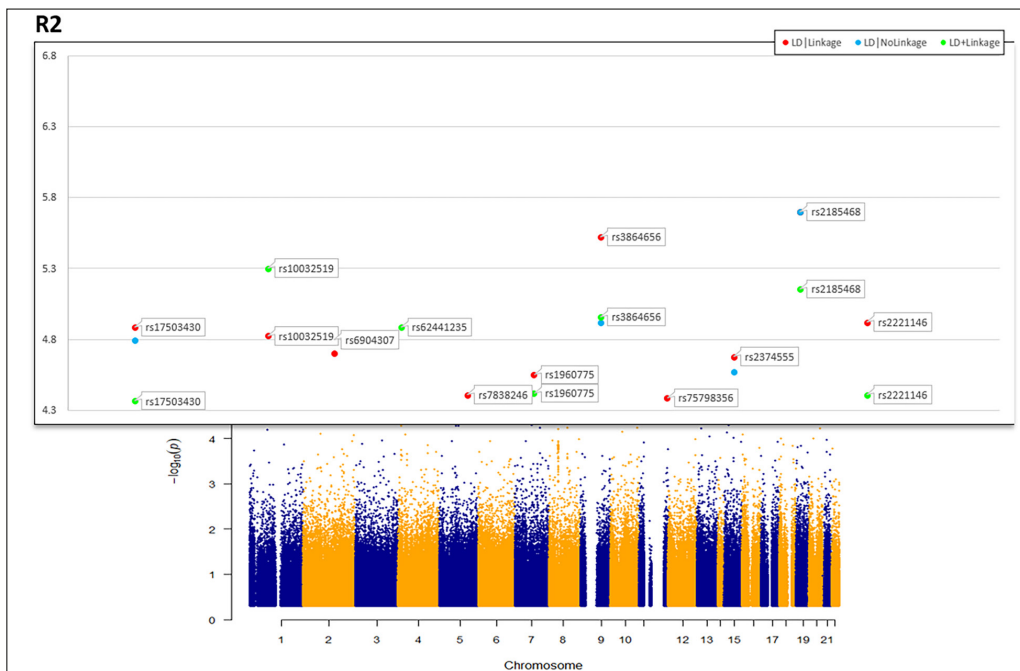
**Figure 1.** Manhattan plot for genome-wide linkage and linkage disequilibrium with polycystic ovarian syndrome under the dominant with complete penetrance model (D1). For each genome-wide significant SNP in polycystic ovarian syndrome, we present the  $-\log_{10}(P)$  as a function of the test statistics and highlight above the significant ( $p < 0.00005$ ) test statistics [(Linkage disequilibrium (LD)|Linkage, LD|NoLinkage, and LD + Linkage)] per inheritance model D1: dominant, complete penetrance.



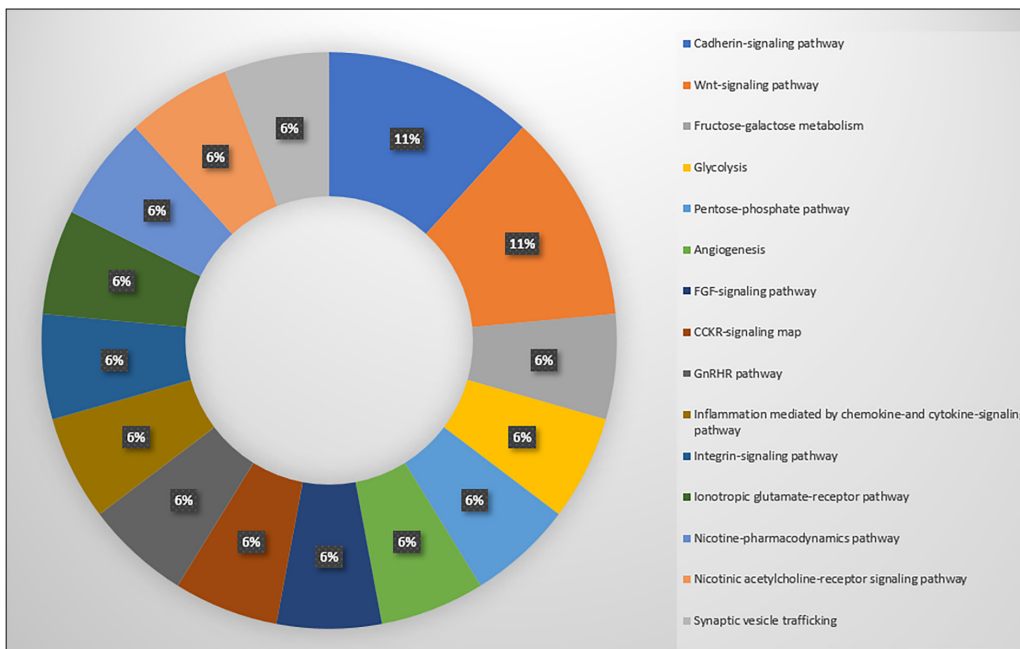
**Figure 2.** Manhattan plot for genome-wide linkage and linkage disequilibrium with polycystic ovarian syndrome under the dominant with incomplete penetrance model (D2). For each genomic-wide significant SNP in polycystic ovarian syndrome, we present the  $-\log_{10}(P)$  as a function of the test statistics and highlight above the significant ( $p < 0.00005$ ) test statistics [(Linkage disequilibrium (LD)|Linkage, LD|NoLinkage, and LD + Linkage)] per inheritance model D2: dominant, incomplete penetrance.



**Figure 3.** Manhattan plot for genome-wide linkage and linkage disequilibrium with polycystic ovarian syndrome under the recessive with complete penetrance model (R1). For each genomic-wide significant SNP in polycystic ovarian syndrome, we present the  $-\log_{10}(P)$  as a function of the test statistics and highlight above the significant ( $p < 0.00005$ ) test statistics [(Linkage disequilibrium (LD)|Linkage, LD|NoLinkage, Linkage|LD, and LD + Linkage)] per inheritance model: R1: recessive, complete penetrance.



**Figure 4.** Manhattan plot for genome-wide linkage and linkage disequilibrium with polycystic ovarian syndrome under the recessive with incomplete penetrance model (R2). For each genomic-wide significant SNP in polycystic ovarian syndrome, we present the  $-\log_{10}(P)$  as a function of the test statistics and highlight above the significant ( $p < 0.00005$ ) test statistics [(Linkage disequilibrium (LD)|Linkage, LD|NoLinkage, and LD + Linkage)] per inheritance model R2: recessive, incomplete penetrance.



**Figure 5.** Pathways analysis for genome-wide significantly genes linked to and/or associated with polycystic ovarian syndrome ( $p < 0.00005$ ). We present the significant pathways for the genome-wide genes significantly linked to and/or associated with polycystic ovarian syndrome ( $p < 0.00005$ ) analyzed by PANTHER. Wnt = Wingless-related integration site, FGF = Fibroblast growth factor, CCKR = cholecystokinin receptor, GnRHR = Gonadotropin-releasing hormone receptor. The indicated percentage refers to the genes reaching genome-wide significance within a specific pathway across the total of genome-wide significant genes.

**Table I.** Risk variants and genes significantly linked to and/or in linkage disequilibrium with polycystic ovarian syndrome ( $p < 0.00005$ ).

Model <sup>l</sup>	Chr	Position	SNP	Ref/Alt	Risk Allele	Gene	Reported in PCOS or Related Phenotype(s)?
R1	Chr01	242932849	rs10737886	G/A	G	-	Novel
R1	Chr01	22362851	rs72649450	G/T	T	-	Novel
R1	Chr01	202462315	rs116062217	C/T	C	<i>PPP1R12B</i>	Novel
R1	Chr01	83144353	rs115853069	G/T	T	<i>LOC107985037</i>	Novel
D1, D2, R1	Chr01	5218182	rs79448783	C/T	T	-	Novel
D2, R2	Chr01	71527609	rs17503430	C/T	T	<i>NEGR1</i>	BMI42, obesity <sup>43</sup> and age of menarche <sup>44</sup>
R1	Chr02	179175932	rs4894082	G/T	T	<i>SESTD1</i>	Novel
D1	Chr02	234633786	rs13402575	C/T	T	2 kb upstream of <i>LOC105373936</i>	Novel
D1	Chr02	38298465	rs61756317	T/C	C	<i>ATL2</i>	Novel
D1	Chr02	226493033	rs116008141	C/T	T	-	Novel
D1	Chr02	226536603	rs74671850	C/T	T	-	Novel
D1	Chr02	78139065	rs2861265	C/T	T	<i>LOC101927967</i>	Novel
R1	Chr03	59433128	rs9852148	C/T	T	<i>LOC105377110</i>	Novel
R1	Chr03	107377700	rs709564	G/A	G	<i>CCDC54</i>	Novel
R1	Chr04	19004092	rs73234185	A/G	G	<i>LOC107986263</i>	Novel
R1, R2	Chr04	138604261	rs10032519	T/C	T	-	Novel
R1	Chr04	15381910	rs4388081	T/C	C	<i>CIQTNF7</i>	Insulin resistance <sup>49</sup>
D2	Chr04	178088516	rs1462506	C/T	C	-	Novel
R1, R2	Chr04	15968726	rs2240688	T/G	G	<i>PROM1</i>	Novel
D1	Chr04	57952725	rs17237364	C/T	C	-	Novel
D1	Chr05	31665181	rs72753574	G/A	A	<i>PDZD2</i>	Upregulated in T2D
D1	Chr05	142626129	rs114948675	T/C	C	<i>FGF1</i>	Serum FGF1 levels are abnormal in PCOS <sup>62</sup>
D1	Chr05	64386935	rs116737809	G/A	A	-	Novel
D1, R1	Chr06	56425611	rs607935	C/A	A	-	Novel
R2	Chr06	139349999	rs62441235	C/T	C	-	Novel
D1	Chr06	56416128	rs686202	G/A	A	-	Novel
R1, R2	Chr06	57256886	rs6904307	A/G	G	-	Novel
D2	Chr06	5571777	rs77236516	A/C	C	<i>FARS2</i>	Insulin resistance in mice <sup>56</sup>
R1	Chr07	156884573	rs728419	C/T	C	<i>LMBR1</i>	Novel
R1	Chr07	79823526	rs12668600	T/C	C	<i>LOC105375371</i>	Novel
D1, R1	Chr07	79784784	rs78623181	C/T	T	<i>LOC105375371</i>	Novel
D2	Chr07	14224564	rs75019655	C/A	A	<i>DGKB</i>	T2D <sup>42,48</sup>
R1	Chr07	119901960	rs116930961	A/G	G	<i>LINC02476</i>	Novel
R1, R2	Chr08	95858411	rs3864656	T/C	C	-	Novel
D2, R2	Chr08	42730154	rs7838246	A/G	G	<i>CHRNA3</i>	Waist circumference <sup>58</sup> and insulin resistance <sup>59</sup>
D1	Chr08	27311717	rs12679570	C/T	T	<i>PTK2B</i>	Novel
R1, R2	Chr08	83106775	rs1960775	G/A	G	-	Novel
D1, R1, R2	Chr09	20412030	rs75798356	T/C	C	<i>MLLT3</i>	Novel
R1	Chr09	135765207	rs58604946	T/G	T	<i>KCNT1</i>	Novel
R1	Chr10	126102428	rs34202198	C/T	T	<i>ADAM12</i>	LH levels in PCOS <sup>65</sup>
R1	Chr10	126116507	rs1278389	A/G	A	<i>ADAM12</i>	LH levels in PCOS <sup>65</sup>
R1	Chr10	126124614	rs1296669	T/C	T	<i>ADAM12</i>	LH levels in PCOS <sup>65</sup>
R1	Chr10	69329923	rs12355201	A/G	A	<i>HK1</i>	HbA1C level <sup>50</sup>
D2	Chr10	13522299	rs80325580	T/C	C	<i>BEND7</i>	Novel

Continued

**Table I (continued).** Risk variants and genes significantly linked to and/or in linkage disequilibrium with polycystic ovarian syndrome ( $p < 0.00005$ ).

Model <sup>1</sup>	Chr	Position	SNP	Ref/Alt	Risk Allele	Gene	Reported in PCOS or Related Phenotype(s)?
D1, R1	Chr11	72100511	rs76397586	G/C	C	<i>LAMTOR1</i> <i>LRTOMT</i>	Insulin resistance in mice <sup>57</sup> Upregulated in T2D <sup>55</sup>
R1	Chr11	45351795	rs61882560	G/C	C	-	Novel
R1	Chr11	104998981	rs523104	G/C	C	<i>CASP5</i>	Novel
D2	Chr11	134477799	rs75517460	A/G	G	<i>B3GAT1-DT</i>	HbA1C levels <sup>51</sup>
D1, R1	Chr11	72279338	rs79654050	G/A	A	-	Novel
R1	Chr11	71530961	rs72958308	A/G	G	-	Novel
D1	Chr11	65078680	rs117357316	C/T	T	<i>CDC45</i>	Novel
R1	Chr11	22397463	rs2665714	A/G	A	-	Novel
R1, R2	Chr12	105878162	rs2374555	G/A	A	-	Novel
D1, R1	Chr12	92443974	rs117027874	G/A	A	-	Novel
D2	Chr12	120770435	rs73411916	T/C	C	<i>SPPL3</i>	Fat deposition <sup>60</sup>
D2	Chr12	120896330	rs11065318	C/A	A	<i>SPPL3</i>	Fat deposition <sup>60</sup>
D2	Chr12	120903362	rs7486605	C/T	T	<i>SPPL3</i>	Fat deposition <sup>60</sup>
R1	Chr12	87844628	rs11104639	G/A	G	-	Novel
R1, R2	Chr13	77092041	rs2185468	C/A	A	<i>MYCBP2</i>	Novel
D2	Chr13	42402021	rs77979811	C/T	T	-	Novel
D1	Chr13	66600253	rs73194764	A/G	G	<i>PCDH9</i>	Novel
R1	Chr13	111449939	rs1151429	C/T	T	-	Novel
D2	Chr13	42444658	rs78059020	T/G	G	<i>LINC02341</i>	Novel
D2, R1	Chr14	72958656	rs35481507	C/T	T	<i>DCAF4</i>	Novel
D2	Chr15	63073961	rs78729321	A/G	G	-	Novel
D2	Chr15	63071899	rs7178040	G/T	T	<i>TPMI</i>	Novel
R1	Chr15	53983656	rs2616911	G/A	G	<i>UNC13C</i>	FSH levels in PCOS <sup>65</sup>
D1	Chr15	62339215	rs289106	C/T	T	-	Novel
R1	Chr15	42040739	rs72726102	C/A	A	<i>PLA2G4E</i>	Downregulated in T2D <sup>54</sup>
D1	Chr17	6865000	rs16956310	T/C	C	<i>ALOX12P2</i>	Novel
D1	Chr17	6873148	rs59046444	T/C	C	<i>ALOX12P2</i>	Novel
D2	Chr17	9601625	rs4791353	G/A	A	<i>CFAP52</i>	Novel
R1	Chr17	52770506	rs4395119	G/T	G	-	Novel
D2	Chr17	66857694	rs56030074	C/T	T	<i>CACNG5</i>	Novel
D1	Chr18	73545694	rs74665677	G/A	A	-	Novel
R1	Chr18	65814857	rs17075246	A/G	G	<i>CDH7</i>	Novel
D2	Chr18	8257258	rs8094332	A/G	G	<i>PTPRM</i>	Age of first birth & number of children <sup>66</sup>
R1, R2	Chr20	55003965	rs2221146	G/C	C	-	Novel
D1, D2, R1	Chr22	21048083	rs77133550	G/A	A	<i>LRRC74B</i>	Novel

<sup>1</sup>Models: D1: dominant, complete penetrance, D2: dominant, incomplete penetrance, R1: recessive, complete penetrance, R2: recessive, incomplete penetrance; - = intergenic; BMI: body mass index, T2D: type 2 diabetes; FGF1: fibroblast growth factor 1; PCOS: polycystic ovarian syndrome; LH: luteinizing hormone; HbA1c: glycated hemoglobin; FSH: follicle-stimulating hormone; kb: Kilobase.

familial study, we reported several novel variants, genes, and pathways potentially implicated in the pathogenesis of PCOS. PCOS-family based studies are lacking; and the one prior family study reporting loci associated with the risk of PCOS had only the probands affected and tested only 10 variants<sup>22</sup>.

We conducted the first PCOS-related family-based GW-linkage and -association study in multigenerational Italian families and identified a total of 79 novel variants, of which 50 are in 45 new risk genes and 29 variants are intergenic (Table I) linked to and/or in linkage disequilibrium and thus associated with

PCOS. None of the genes reported in our study has been previously reported as a risk gene in PCOS. Several genes were, however, implicated in one or more of PCOS-related phenotypes (i.e., BMI, obesity, insulin resistance, PCOS abnormal serum FGF1 levels, glycated hemoglobin [HbA1c] levels, luteinizing hormone [LH] or follicle-stimulating hormone [FSH] levels, fat deposition in PCOS, T2D, age of menarche, subfertility, reproductive behavior, and number of children [Table I]) and could therefore have served as candidate genes. Variants in the neuronal growth regulator 1 (*NEGR1*) gene have previously been studied in PCOS, but no association has been found<sup>41</sup>. The *NEGR1* gene is, however, associated with BMI<sup>42</sup>, obesity<sup>43</sup> and age of menarche<sup>44</sup> and has been reported as a PCOS-candidate gene<sup>45</sup>. Our study is, therefore, the first to confirm the association of *NEGR1* with PCOS.

Several genes reported in our study are implicated in metabolic phenotypes and traits, such as obesity, glucose metabolism, and/or insulin resistance (Table I), which are all essentially related to the pathogenesis of PCOS<sup>6,46,47</sup>. The diacylglycerol kinase beta (*DGKB*) and the C1q and tumor necrosis factor (TNF) related 7 (*CIQTNF7*) genes reported in our study are respectively associated with T2D<sup>48</sup> and IR<sup>49</sup> and variants in the hexokinase 1 (*HK1*) and the B3GAT1 divergent transcript (*B3GAT1-DT*) genes are associated with HbA1C levels<sup>50,51</sup>. The latter gene (*B3GAT1-DT*) is also associated with insulin secretion<sup>52</sup>. The three genes (PDZ domain containing 2 [*PDZD2*], leucine rich transmembrane and O-methyltransferase domain containing [*LRTOMT*], and phospholipase A2 group IVE [*PLA2G4E*]) are differentially expressed in pancreatic islets of patients with T2D (*PDZD2*)<sup>53</sup> or without T2D (*PLA2G4E*)<sup>54</sup> or in the peripheral blood of patients with T2D and fatigue (*LRTOMT*)<sup>55</sup>.

High expression of phenylalanyl-tRNA synthetase 2, mitochondrial (*FARS2*) in mice is associated with features of T2D<sup>56</sup>, and late endosomal/lysosomal adaptor, MAPK and MTOR activator 1 (*LAMTOR1*)<sup>57</sup> knockout-mice are protected from insulin resistance when fed a high fat diet<sup>57</sup>. The cholinergic receptor nicotinic beta 3 subunit (*CHRNA3*) gene is associated with waist circumference<sup>58</sup> and insulin resistance<sup>59</sup>. A variant near the *SPPL3* gene was previously found to be associated with body fats deposition<sup>60</sup>. One of *SPPL3* PCOS-risk variants reported in our study was predicted to disrupt the binding of the neuronal specific bHLH1 TF, which belongs to a family of TFs involved in neural growth and development<sup>40</sup>. Interestingly, defects in the mouse homologous of the human basic helix-loop-helix 2

(bHLH2) TF cause in mice disruption of the hypothalamic-pituitary axis, obesity, hypogonadism, and infertility<sup>61</sup>. On the other hand, the *FGF1* gene, which we detected as a PCOS-risk gene, encodes the fibroblast growth factor 1 whose serum levels are either increased or decreased in patients with PCOS<sup>62</sup>. In mice, the FGF1 protein lowers hepatic glucose production<sup>63</sup> and *FGF1*-knockout mice have insulin resistance<sup>64</sup>.

Three genes in our study (a disintegrin and metalloprotease domain [ADAM] metallopeptidase domain 12 [*ADAM12*], unc-13 homolog C [*UNC13C*] and protein tyrosine phosphatase receptor type M [*PTPRM*]) have roles in other PCOS-related phenotypes: *ADAM12* and *UNC13C* genes are, respectively, associated with serum LH and FSH levels in PCOS<sup>65</sup>, and the *PTPRM* gene has a role in the age at first birth and number of born children<sup>66</sup>.

The remaining PCOS-risk genes detected in our study are all newly implicated in PCOS and were never reported in any PCOS-related phenotype (i.e., irregular menses, anovulation, infertility, oligomenorrhea, obesity, insulin resistance, T2D, hyperandrogenism, hirsutism, male-pattern baldness) and are the following: protein phosphatase 1 regulatory subunit 12B (*PPP1R12B*), SEC14 and spectrin domain containing 1 (*SESTD1*), atlastin GTPase 2 (*ATL2*), *PROM1*, limb development membrane protein 1 (*LMBR1*), long intergenic non-protein coding RNA 2476 (*LINC02476*), protein tyrosine kinase 2 beta (*PTK2B*), *MLLT3*, potassium sodium-activated channel subfamily T member 1 (*KCNT1*), caspase 5 (*CASP5*), cell division cycle associated 5 (*CDC5*), protocadherin 9 (*PCDH9*), DDB1 and CUL4 associated factor 4 (*DCAF4*), tropomyosin 1 (*TPMI*), cilia and flagella associated protein 52 (*CFAP52*), cadherin 7 (*CDH7*), MYC binding protein 2 (*MYCBP2*), arachidonate 12-lipoxygenase pseudogene 2 (*ALOX12P2*), calcium voltage-gated channel auxiliary subunit gamma 5 (*CACNG5*), coiled-coil domain containing 54 (*CCDC54*), BEN domain containing 7 (*BEND7*), and leucine rich repeat containing 74B (*LRRC74B*). All genes identified in our study are novel and involved in 15 genes' sets pathways, which all have been associated with PCOS<sup>67-74</sup>, with the exception of the Fructose-galactose metabolism, Ionotropic glutamate-receptor pathway, Nicotinic acetylcholine-receptor signaling pathway, Synaptic vesicle trafficking, and CCKR-signaling map, which thus are five novel pathways identified in our study. Interestingly, 6% of genes in our study were implicated in the GnRHR pathway, which is directly involved in PCOS<sup>75</sup>. Of further interest, the *PROM1* gene en-



codes CD133 whose circulating level is decreased in amenorrhoeic subjects compared to healthy controls<sup>76</sup>. Specifically, circulating levels of CD133(+) bone marrow-derived stem cells increased with glucose load in healthy females but were significantly reduced in amenorrhoeic women. Oral glucose-induced increase in circulating CD133(+) bone marrow-derived stem cells and endothelial differentiation potential of peripheral blood-derived endothelial progenitor cells were attenuated in insulin resistant amenorrhoeic women<sup>76</sup>. This could explain a reduced potential of cell regeneration in women with oligo- or amenorrhoeic cycles. The *PROM1* gene 3'-UTR variant rs2240688, found to confer PCOS risk in our study, was predicted to create a new binding site for the miRNA hsa-miR-135a (SNP Function Prediction)<sup>36</sup>. miRNAs are known to be involved in the pathogenesis of PCOS<sup>77</sup> and hsa-miR-135a in particular is elevated in patients with endometriosis<sup>78</sup>. Endometriosis is a common condition, representing per a novel hypothesis the other extreme phenotype of PCOS and a PCOS-related diametric (opposite) outcome of variation in the hypothalamic-pituitary gonadal axis development and activity, for which while endometriosis is mediated by low prenatal and postnatal testosterone levels, PCOS is mediated by high prenatal testosterone levels<sup>79</sup>.

## Conclusions

This is the first GW-linkage and LD study performed in families with PCOS, and namely from the Italian peninsula. The study reports novel risk variants, genes, and pathways implicated in the risk of PCOS at least in Italian families. Functional and replication studies in other ethnicities are needed.

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## Authors' Contribution

C.G. conceived, performed, and supervised the project, including statistical analysis and manuscript drafting and revision. M.A. helped with the bioinformatic analysis, literature search, and manuscript drafting. Both authors have approved the final manuscript.

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## Informed Consent

Families were recruited following the Helsinki Declaration guidelines, and individuals provided written informed consent prior to participation.

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## Ethics Approval

The Bios Ethical Committee approved this study (Prot. PR/Mg/Cg/311708).

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## Availability of Data and Materials

The study data are available on reasonable request, and due to lacking specific patients' consent and privacy restrictions, they are not publicly available.

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## Conflict of Interests

The authors have declared that they have no conflicts of interest.

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