

1 **Risk of recurrent pregnancy loss in the Ukrainian population using a combined effect of genetic**
2 **variants**

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18

19 **Abstract**

20 Recurrent pregnancy loss (RPL) affects nearly 5% of the women of reproductive age. Its heterogeneous
21 and multifactorial nature complicate both diagnosis and treatment, as well as identification of the genetic
22 contribution to RPL. Evidence about the aetiology of RPL is controversial; however, several biological
23 mechanisms have been proposed. Given the current knowledge about the genetic susceptibility to
24 idiopathic RPL, we aimed to evaluate the predictive ability of a combined variant panel to the risk of
25 RPL in the Ukrainian sample of 114 cases and 106 healthy controls. We genotyped variants within the
26 12 genetic loci reflecting the main biological pathways involved in pregnancy maintenance: blood
27 coagulation (*F2*, *F5*, *F7*, *GP1A*), hormonal regulation (*ESR1*, *ADRB2*), endometrium and placental
28 function (*ENOS*, *ACE*), folate metabolism (*MTHFR*) and inflammatory response (*IL6*, *IL8*, *IL10*). We
29 showed that a genetic risk score (GRS) calculated from the 12 variants was associated with an increased
30 risk of RPL (odds ratio 1.56, 95% CI: 1.21,2.04, $P=8.7\times 10^{-4}$). The receiver operator characteristic
31 (ROC) analysis resulted in the area under the curve (AUC) of 0.64 (95% CI: 0.57, 0.72), indicating an
32 improved ability of the GRS to classify women with and without RPL. In summary, implementation of
33 the GRS approach can help defining women at higher risk to complex multifactorial conditions such as
34 RPL. Future well-powered genome-wide association studies will help in the dissection of biological
35 pathways not hypothesised previously for RPL and further improve the prediction and identification of
36 those at risk for RPL.

37

38

39 **Introduction**

40 The loss of two or more sequential pregnancies in the first trimester of gestation is defined as recurrent
41 pregnancy loss (RPL)(1). Nearly one in twenty women of reproductive age is affected by this
42 condition(2). Heterogeneity and multifactorial nature of RPL complicate both diagnosis and treatment
43 of RPL, thus causing severe distress for affected couples and their clinicians(3,4). Despite a large
44 number of clinical and genetic studies aiming to identify probable causes and suitable treatments of
45 RPL, most of the findings remain controversial and demand replication(3,5).

46

47 The vast majority of early pregnancy losses (50%–60%) are the consequence of chromosomal
48 abnormalities, which can be of parental origin, or arise de novo in the embryo from parents with normal
49 chromosomes(6,7). Nonetheless, endocrine, immunological, anatomical and other hypotheses are
50 proposed to play a leading role in RPL aetiology, with most of the remaining RPL cases being
51 idiopathic(5,8). In patients with idiopathic RPL, a multifactorial nature of the condition is usually
52 suggested, with genetic component viewed as an important risk factor(5,9,10). Large-scale genome-
53 wide association studies (GWAS) in appropriately defined individuals should enable better dissection
54 of pregnancy maintenance/loss mechanisms, as well as provide evaluation of miscarriage risks in
55 couples with reproductive complications. However, the genetic susceptibility to RPL in female health
56 has not been addressed. The identification of RPL cases is laborious and expensive, hindering the setup
57 of a well-powered GWAS for this outcome. Many studies, including the UK Biobank consisting of
58 500,000 individuals, have collected data on self-reported miscarriages and the number of spontaneous
59 miscarriages. GWAS on the UK Biobank data(11) on such surrogate phenotypes for RPL have not
60 resulted in any common variants associated with RPL at genome-wide significance, plausibly reflecting
61 an inaccurate re-call and complex genetic susceptibility to RPL.

62

63 While more precise data on idiopathic RPL are being collected allowing well-powered GWAS in the
64 future, our best approach is to look at the potential biological mechanisms proposed for RPL
65 pathogenesis and use such information to infer the potentially relevant genes in RPL susceptibility. The
66 suggested mechanisms include alterations in blood coagulation, hormonal regulation, endometrium and
67 placental function, folate metabolism and inflammatory response.

68

69 *Blood coagulation.* Haemostasis-related genes, such as the coagulation factor II and V genes (*F2* and
70 *F5*, respectively), have been linked to venous thromboembolism and thrombosis in recent GWAS(12–
71 15). They contribute to hereditary thrombophilia, and it has been suggested that they could act
72 throughout pregnancy, causing miscarriages(16). Indeed, a study on *F2* and *F5* genes has shown
73 associations with variation in these genes and RPL(17). Associations between polymorphisms in the
74 coagulation factor VII (*F7*) gene and recurrent miscarriages were also reported in a study from

75 Poland(18). Another strong candidate within the blood coagulation pathway to RPL is the glycoprotein
76 Ib (platelet), alpha (*GP1A*) gene which is an important player in the platelet adhesion to collagen(19).

77

78 *Hormonal regulation.* The relevance of hormonal regulation in the susceptibility of RPL comes from
79 the knowledge that estrogens modulate multiple reproductive functions, including progesterone
80 production and uteroplacental blood flow(20). Estrogen receptors (ERs), which in human consist of ER α
81 and ER β , encoded by *ESR1* and *ESR2* genes, respectively, are mediators of estrogen signalling and
82 function (21,22). A study of *ESR1* locus variants and RPL did not yield support for the association(23);
83 however, recent GWAS have linked variation within *ESR1* to susceptibility to endometriosis(24) and to
84 maternal age at first birth(25). Stress-induced adrenergic receptor (*ADRB2*) activation may in turn
85 directly affect embryo-maternal interactions during implantation, resulting in pregnancy complications
86 and miscarriage (26). No studies have directly assessed the association with variation in this gene and
87 RPL; however, controversial reports for the effects of *ADRB2* variants have been reported on preterm
88 delivery (27,28) and its potential role was suggested as being a drug target for prevention of preterm
89 delivery (29).

90

91 *Endometrium and placental function.* Abnormalities of placental vasculature in the chorionic villi of
92 RPL patients can be determined through low expression levels of angiogenesis-related genes, such as
93 the endothelial nitric oxide synthase (*ENOS*) and angiotensin I-converting enzyme (*ACE*) genes.
94 Variability within these genes may result in gestational complications, including pregnancy loss, pre-
95 eclampsia, intrauterine foetal death and growth restriction (30). More specifically, variability in *ACE* is
96 associated with RPL (31). The *ACE* gene, which generates angiotensin II from angiotensin I as a potent
97 vasopressor (32,33), is a key component of the rennin-angiotensin system (RAS) that affects
98 homeostasis (34). There is evidence that the presence of the D allele or D/D genotype is correlated with
99 elevated plasma and tissue-specific ACE activity (35,36). In turn, eNOS is the main enzyme required
100 for vascular NO production, by converting L-arginin to L-citrulline. *eNOS* is expressed in the terminal
101 chorionic villous vessels and in the cyto- and syncytio-trophoblast layers during the first trimester (37).

102

103 *Folate metabolism.* Variation within the 5,10-methylenetetrahydrofolate reductase (*MTHFR*) gene is
104 associated with higher homocysteine (38,39) and serum folate concentrations (40). Mild elevations in
105 the total plasma homocysteine (tHcy) concentration, a risk factor for placental abruption, and infarction
106 and preeclampsia (41), are also associated with an increased risk of RPL (42–46). Furthermore, Nelen
107 *et al.* demonstrated that the homozygosity for a common 677C→T mutation in the *MTHFR* gene leads
108 to a two-fold to three-fold higher risk of RPL (46). Another association study between *MTHFR* and RPL
109 was inconclusive, despite a large sample size of 1,830 cases and 3,037 controls (47).

110

111 *Inflammation*. Cytokines form a complex regulatory network which maintains homeostasis between the
112 foetus and maternal immune system. If this delicate balance is adversely affected, immunoregulatory
113 mechanisms may be insufficient to restore homeostasis and this may lead to pregnancy failure (48).
114 Variation especially at the inflammatory gene *IL10* has been associated with REPL (OR=3.01, P-
115 value<10⁻⁴)(49), whereas the evidence between its association with RPL has been less conclusive (50),
116 similarly to *IL6* and RPL (51). In addition, the chemokine IL-8 is a crucial player in the process of
117 implantation, promoting trophoblastic cells migration and invasion (52). Moreover, microRNA studies
118 for endometriosis have shown the potential role of IL-8 levels in the pathogenesis of endometriosis via
119 stimulating endometrial stromal cell invasiveness (52).

120

121 Given the current knowledge about the genetic contribution to idiopathic RPL, we aimed to evaluate the
122 predictive ability of a combined gene set of RPL associated DNA variants to the risk of RPL in a
123 Ukrainian sample of 114 cases and 106 healthy controls. We genotyped variants at/within 12 genes
124 reflecting the main biological pathways involved in pregnancy maintenance: blood coagulation (*F2*, *F5*,
125 *F7*, *GPIA*), hormonal regulation (*ESR1*, *ADRB2*), endometrium and placental function (*ENOS*, *ACE*),
126 folate metabolism (*MTHFR*) and inflammatory response (*IL6*, *IL8*, *IL10*).

127

128 **Material and Methods**

129 *Study sample*

130 REPLIK (REcurrent Pregnancy Loss In Kiev) study case group comprised 114 unrelated women at a
131 mean age of 34.2 (SD 4.5) years with idiopathic RPL history undergoing observation in the State
132 Institution “Institute of Paediatrics, Obstetrics and Gynaecology of NAMS of Ukraine” and perinatal
133 clinic “ISIDA”. All the women were of Ukrainian territory descent from across Ukraine. RPL diagnosis
134 was determined in case of at least two consequent miscarriages in the first trimester (mean number of
135 foetal losses 2.7, SD 0.9). The American Society for Reproductive Medicine defines RPL as two or
136 more clinical pregnancy losses, not necessary consecutive, documented by ultrasonography or
137 histopathologic examination(53). In order to ensure the idiopathic nature of RPL in the studied patients,
138 the following enrolment criteria were set: absence of a family history of birth defects; absence of the
139 genital tract anatomic abnormalities, confirmed by ultrasonography or hysterosalpingography; a normal
140 karyotype of both the studied individual as well as their partner, defined by GTG-banded chromosome
141 analysis including GTG-banded metaphase plates with a minimum resolution of 400–450 bands per
142 each sample. Moreover, blood tests for immunologic risk factors (anti-nuclear antibodies, anti-
143 phospholipid antibodies, lupus anticoagulant), defects of thyroid function, diabetes mellitus,
144 hyperprolactinemia and infections such as chlamydia were performed, and none of the individuals
145 positive were included into the study group. A control group comprised 106 unrelated healthy women
146 at a mean age of 26.2 (SD 3.0) years with no history of RPL or other pregnancy complications, no foetal
147 losses, and have given birth to at least one naturally conceived child. Prior to clinical examination and

148 genotyping, all participants had given their informed consent. The study has been approved by The
149 Bioethical Committee of Institute of Molecular Biology and Genetics of NAS of Ukraine.

150

151 *Blood sample collection, DNA extraction and genotyping procedures*

152 Venous blood samples from patients and control group individuals were collected into 4ml vacutainer
153 tubes containing EDTA. Genomic DNA was extracted from blood samples by standard method using
154 proteinase K with the following chlorophorm extraction. We used 13 genetic variants previously
155 associated with RPL in European populations or those representing genetic networks of pathological
156 processes leading to RPL (**Table 1** provides information about variants and reference papers). A SNP
157 located in *IL10* gene (rs1800872) was excluded from the polygenic risk score calculation due to high
158 LD ($r^2=0.26$ in Europeans) with a nearby SNP included in the study (rs1800896). Genotyping for
159 selected polymorphic variants was performed by common variations of PCR-based assays as described
160 previously (**Table 1**) with slight modifications. We identified genotypes for all genotyped individuals
161 without any missing values. However, genotyping of the 13 variants was done for the individuals
162 depending on their time of joining the project and availability of the reagents (**Table 2** shows the
163 numbers of cases and controls genotyped for each variant).

164

165 *Association analysis*

166 We performed single-variant association analyses between each of genotyped variants and RPL. We
167 used logistic regression for single-variant analyses assuming a log-additive model of association,
168 similarly to standard assumptions in GWAS. We report estimates of ORs along with their 95%
169 confidence intervals (CIs).

170

171 *Genetic risk score calculation*

172 We calculated the genetic risk score (GRS) using information from a set of 12 variants previously
173 associated with recurrent pregnancy loss (RPL) (**Table 1**). Among genotyped variants, there are ten
174 SNPs, rs1799752 at *ACE* gene is an insertion/deletion (indel), and another is a tandem repeat (VNTR)
175 in the intron 4 of *ENOS* gene. The risk allele count for each SNP was weighted by its established effect
176 size using previously published findings. The effect sizes were estimated from the odds ratios (ORs) in
177 the form of beta coefficients ($\log(\text{OR})$) for association between GRS and RPL assuming an additive
178 genetic model for association. The weighted GRS was corrected for missing genotypes by multiplying
179 the score with the total number of variants and then dividing by the number of genotyped variants per
180 person, i.e. the scores for people with less genotyped variants got more weight (54). The effect estimate
181 for rs1800896 located at *IL10* was from a multi-ethnic study, discordant from our study's ethnic descent.
182 We therefore used the present study effect estimate, which was still smaller than that published for the
183 other *IL10* variant. In addition, for the variants in *F7*, *GPIA*, *ADRB2* and *IL8* there were no published
184 studies for their association with RPL. Hence, we used the effect sizes from our data as weights. As a

185 sensitivity check we also calculated the GRS using weights from our study only. Finally, we calculated
186 an unweighted GRS and evaluated its effect on RPL.

187

188 *Receiver operating characteristic analysis*

189 Next, we performed receiver operating characteristic (ROC) analysis to determine the predictive value
190 of the estimated GRS in RPL. The efficacy of the GRS prediction is measured using the area under the
191 curve (AUC) which is the statistic calculated on the observed case scale. The statistical analyses were
192 conducted using the statistical software pROC package in R along with other functions (55).

193

194 **Results**

195 *Association analysis*

196 We tested the 13 genetic variants for association with RPL in the REPLIK study from Ukraine. Within
197 this variant set only rs1800896 at *IL10* gene was nominally associated with RPL (OR[95% CI]:
198 1.60[1.07, 2.42], $P=0.025$, **Table 2**). Whereas the other variants did not reach nominal significance, five
199 out of the eight with an effect estimate available from literature were in the same direction of the effect in
200 our study as in the published ones (**Table 1, Table 2**). The sample sizes varied greatly for the genotyped
201 SNPs, whereas the GRS accounted for the variable number of genotyped SNPs per individual. The
202 association between RPL and the GRS, based on published effect estimates, revealed a statistically
203 significant association ($P=8.7 \times 10^{-4}$) in the REPLIK study. The combined effect of all tested variants
204 resulted in a 1.56 times (95% CI [1.21, 2.04]) increased odds of RPL between cases and controls. The
205 sensitivity analysis using the GRS with weights from our study effect estimates resulted in an OR of
206 1.83 (95% CI [1.34, 2.57], $P=3.0 \times 10^{-4}$). The unweighted GRS was also associated with an increased risk
207 of RPL with an OR of 1.16 (95% CI [1.05, 1.29], $P=2.0 \times 10^{-3}$).

208

209 *Receiver Operator Characteristic analysis*

210 The ROC analysis showed an area under the curve (AUC) of 0.64 (95% CI [0.57, 0.72]). This indicates
211 a moderate to high ability for the GRS to correctly classify women with and without RPL. The sensitivity
212 of 72% at the best discriminating point implies that the GRS can effectively identify women having
213 experienced pregnancy losses (**Figure 1**). The AUCs for the GRS using our study effect estimates as
214 weights and for the unweighted GRS were 0.64 (95% CI [0.57, 0.71]) and 0.62 (95% CI [0.55, 0.70]),
215 respectively.

216

217 **Discussion**

218 In this study we evaluated the combined effect of 12 genetic variants on RPL risk through GRS
219 implemented in a case-control REPLIK study from the Ukraine. We showed that even with such a small
220 number as 12 variants, when carefully chosen, we can already achieve predictive ability using weighted
221 GRSs.

222

223 For some of the variants used (within *F2*, *F5*, *ACE*, *IL10*) we had previous evidence for their association
224 with RPL (17,31,49), whereas others (within *F7*, *GPIA*, *ESRI*, *ADRB2*, *ENOS*, *MTHFR*, *IL6*, *IL8*) were
225 chosen for their hypothesised biological mechanisms (18,19,23,27,28,47,51,52,56). The difficulty in
226 establishing genetic associations with the complex condition of RPL was reflected in our single-variant
227 analyses, i.e. we could not confirm the associations with RPL for majority of the variants with our
228 available sample. A likely contributing factor was the relatively small sample size for some of the
229 variants due to our genotyping strategy. For the *IL10* variant, having the whole sample genotyped, we
230 demonstrated its association with RPL with a similar to previous study effect estimate (49).

231

232 It has been acknowledged that the discrete genetic variants for RPL have a relatively low sensitivity and
233 specificity (3). Each individual case of idiopathic RPL usually cannot be explained by one risk factor
234 and should be treated as a multifactorial condition (9). Indeed, GWAS for complex traits have shown
235 that individual genetic variants usually provide relatively modest contribution to the trait variability in
236 terms of their per-allele effect size, typically in the per-allele effects being within the range of 5-10%
237 increase in risk in relation to that of risk estimated in general population (57), and hence require large
238 sample sizes for detection. Therefore, it may be more effective to evaluate the risk of RPL using a panel
239 of population-specific low-effect genetic markers, representing distinct physiological gene networks.
240 Our selection of the gene panel based on the hypothesised biological pathways proved successful since
241 by combining their effects, we could already predict the risk of RPL in our cohort. The results were not
242 influenced by the selection of the weights, as our sensitivity analyses showed. It is worth noticing that
243 we achieved an AUC of 0.64 (95% CI 0.57-0.72) with already 12 SNPs. A recent study combining
244 millions of SNPs into genome-wide polygenic scores for several complex diseases achieved AUCs of
245 similar strength. For example, an AUC of 0.63 was reported for inflammatory bowel disease from a
246 GRS consisting of 6.9 million SNPs (58). Taken together, our results are important considering that RPL
247 is a laborious and expensive phenotype to collect. Since the start of large-scale genome-wide association
248 studies, RPL has lacked novel insights establishing its underlying genetic mechanisms with no major
249 publications probably due to clinical requirements to the phenotype definition. However, our
250 investigation suggests that even a small number of SNPs in appropriately defined cases and controls can
251 be used for predictive purposes.

252

253 One important limitation of RPL genetic association studies arises from the fact that even though the
254 differences in population frequencies of studied genetic polymorphisms may be significant, ethnicity-
255 specific associations are rarely addressed. Moreover, a vast majority of studies are performed on
256 European and American Caucasians, as well as, less frequently, Southern or Eastern Asians (5,23,59).
257 On one hand, this situation allows increasing the significance of discovered effects in European
258 populations through meta-analyses (17). On the other hand, it complicates adoption of such effect

259 estimates for other ethnic groups due to possible difference in allele frequencies and effect size estimates
260 between populations and ethnic groups (23,56).

261

262 In summary, with the careful selection of the DNA variant set and the implementation of methods such
263 as the GRS, we can predict susceptibility to complex multifactorial conditions such as RPL. With the
264 hope of future well-powered studies, especially GWAS, adding to the knowledge of biological pathways
265 not hypothesised previously for RPL, we will be able to further improve the prediction and identification
266 of those at risk for RPL.

267

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271 **Table 1. Genetic variants used to assess their effect on the risk of RPL in the REPLIK study.**

Locus name	SNP rsID	EA/NE A	EAF (1000 G*)	OR (95% CI)	P-value	Case/Control sample size	Outcome	Reference	Genotyping method	Reference
<i>Blood coagulation</i>										
<i>F2</i>	rs1799963	A/G	0.008	2.00 (1.00,4.00)	< 0.03	342/123	RPL	(17)	RFLP	(60)
<i>F5</i>	rs6025	T/C	0.99	2.5 (1.80,3.40)	< 10 ⁻³	342/123	RPL	(17)	RFLP	(60)
<i>F7</i>	rs6046	G/A	0.89	-17	-	-	-	-	RFLP	(61)
<i>GPIA</i>	rs1126643	T/C	0.40	-	-	-	-	-	RFLP	(62)
<i>Hormonal regulation</i>										
<i>ESR1</i>	rs2234693	T/C	0.58	1.10 (0.57,2.13)	> 0.05	350/646	RPL	(56)	RFLP	(63)
<i>ADRB2</i>	rs1042714	G/C	0.41	-	-	-	-	-	RFLP	(64)
<i>Endometrium and placental function</i>										
<i>ENOS</i>	Intron-4† VNTR	B/A	-	1.005 (0.74,1.37)	> 0.05	410/357	RPL	(23)	Allele-specific PCR	(65)
<i>ACE</i>	rs1799752‡	D/I	-	2.06 (1.46,2.91)	NA	740/329	RPL	(31)	Allele-specific PCR	(66)
<i>Folate metabolism</i>										
<i>MTHFR</i>	rs1801133	A/G	0.36	1.25 (0.93,1.67)	0.14	1830/3037	RPL	(47)	RFLP	(67)
<i>Inflammatory response</i>										
<i>IL6</i>	14718	C/G	-	1.214 (0.88,1.67)	0.24	230/188	RPL	(51)	RFLP	(68)
<i>IL8</i>	rs2227306	C/T	0.61	-	-	-	-	-	RFLP	(69)
<i>IL10</i>	rs1800896	C/T	0.45	1.27 (0.95,1.70)	> 0.05	635/571	RPL	(50)	RFLP	(70)
<i>IL10</i>	rs1800872	T/G	0.76	3.01 (1.92,4.72)	< 10 ⁻⁴	342/123	Early PL	(49)	RFLP	(71)

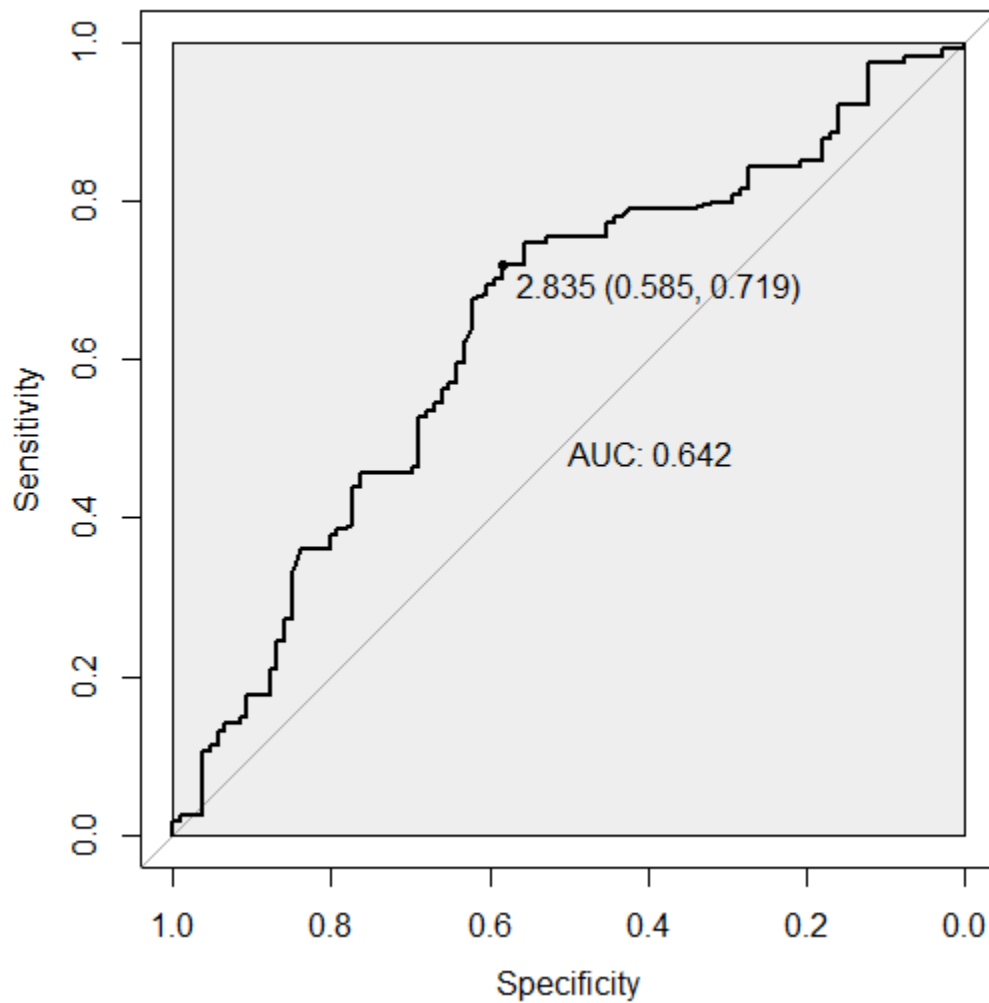
272 Legend: † Indel; ‡ Tandem repeat; EA/NEA - Effect allele/Non-effect allele; *EAF (1000 G) – 1000 Genomes project effect allele frequency in Europeans

1 **Table 2. Associations between 12 previously reported genetic variants and RPL in the REPLIK study.**

Locus name	Chr:Position	Variant ID	EA/NEA	EAF cases/controls	N cases / N controls	EAE	OR (95% CI)	P-value
<i>F2</i>	11:46761055	rs1799963	A/G	0.011/0.72	110/46	0.49	1.64 (0.23, 32.48)	0.66
<i>F5</i>	1:169519049	rs6025	T/C	0.014/0.71	114/46	-0.22	0.80 (0.15, 5.92)	0.80
<i>F7</i>	13:113773159	rs6046	G/A	0.48/0.070	75/46	0.34	1.40 (0.65, 3.04)	0.38
<i>GPIA</i>	5:52347369	rs1126643	T/C	0.35/0.23	81/46	0.35	1.43 (0.85,2.44)	0.18
<i>ESR1</i>	6:152163335	rs2234693	T/C	0.54/0.48	110/106	-0.18	0.84 (0.57, 1.23)	0.37
<i>ADRB2</i>	5:148206473	rs1042714	G/C	0.33/0.25	81/46	0.38	1.47 (0.86,2.56)	0.16
<i>ENOS</i>	15:35147732-35262040	Intron-4† VNTR	B/A	0.55/0.12	102/46	0.15	1.16 (0.63,2.08)	0.63
<i>ACE</i>	17:61565890	rs1799752†	D/I	0.35/0.0023	114/46	-0.048	0.95 (0.59, 1.54)	0.85
<i>MTHFR</i>	1:11856378	rs1801133	A/G	0.21/0.52	114/46	0.33	1.40 (0.80, 2.51)	0.25
<i>IL6</i>	7:22766840	14718	C/G	0.55/0.41	106/86	0.11	1.10 (0.77,1.64)	0.57
<i>IL8</i>	4:74607055	rs2227306	C/T	0.39/0.61	114/106	0.11	1.10 (0.76,1.64)	0.60
<i>IL10</i>	1:206946897	rs1800896	C/T	0.54/0.46	114/106	0.47	1.60 (1.07, 2.42)	0.025
GRS					114/106		1.56 (1.21,2.04)	8.7x10⁻⁴

2 Legend: † Indel; ‡ Tandem repeat; EA/NEA: Risk allele/Alternate allele; EAF: Effect allele frequency; EAE: Estimated allelic effect (beta); GRS, genetic risk
3 score.

1



2

3 **Figure 1. Receiver operator characteristic (ROC) curve for the predictive ability of the genetic risk**
4 **score (GRS) for recurrent pregnancy loss.** The best predictive point is shown with the ideal cut-off
5 for the GRS and with estimates for specificity and sensitivity at that point. *Abbreviation: AUC, area*
6 *under the curve.*

7

8

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