Clustering of known low and moderate risk alleles rather than a novel recessive high-risk gene in non-BRCA1/2 sib trios affected with breast cancer

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Supplementary Methods

Exome sequencing read alignment and variant calling

Analysis of the sequence data was performed within the in-house pipeline framework Biopet (version 0.1.3)[1]. First, raw reads were trimmed based on quality using Sickle (version 1.200)[2] and adapter sequences were removed with the help of Cutadapt (version 1.1)[3]. Afterwards, the quality of the reads was assessed using Fastqc (version 0.10.1)[4]. The reads were then aligned to the human reference genome (hg19) with the help of BWA (version 0.7.8-r455)[5]. After alignment Picard (version 1.109.1722)[6] was used to sort the bam files and to mark duplicate reads. Using GATK (version 3.1-1-gcfc45fd)[7] we applied base quality score recalibration, indel realignment, called variants using HaplotypeCaller and recalibrated variant quality scores using Hapmap, Omni, 1000G and dbSNP for single nucleotide variants and Mills and dbSNP for indels (datasets as provided in gatk_bundle_2.5). Next, variants in the regions described in the family-specific BED files were selected using vcftools (v1.12b)[8].

Imputation of SNP array data for PRS calculation

Imputation was performed (without pre-phasing) with IMPUTE2 (version 2.3.2)[9] using both 1000G (phase 3 b37 haplotypes)[10] and GoNL (release5.3, imputation ready haplotypes)[11] as a reference. We imputed a region of 1Mb around every SNP of interest with a buffer of 500 kb. We set "k" to 200 and "k_hap" to 2000 and 998, for 1000G and GoNL respectively. Before imputation the reference panels were merged" using the "merge_ref_panels" option. The "effective size" of the population (Ne) was set to 20000. To replicate this analysis use "seed" 8256245.

Supplementary Figure 1. Pedigrees of the families included in this study

H indicates that an individual's germline DNA was haplotyped, HE indicates that an individual's germline DNA was both haplotyped and exome sequenced. Under each affected individual for whom germline DNA was available the normalized PRS and OR (in italics) are indicated. The * -symbol indicates individuals carrying the CHEK2*1100delC variant. B= breast cancer, Bl= bladder cancer, Br= brain cancer, C= colon cancer, Ca= cancer not otherwise specified, Cx= cervical cancer, E= esophagus cancer, Hy= hypophysis cancer, L= lung cancer, Leu= leukemia, Li= liver cancer, Ly= lymphoma (not specified), M= melanoma, NHL= non-Hodgkin lymphoma, P= Prostate cancer, Pa= pancreas cancer, Re= renal cancer, S= stomach cancer, Sk = skin cancer (not specified), T= testicular cancer, Th= thyroid cancer. **Supplementary Table 1**

Classification of genes according to level of evidence that protein-truncating variants in these genes are associated with breast cancer

Evidence level*	Genes
1. Strong	ATM, BRCA1, BRCA2, CHEK2, PALB2
2. Syndromic	CDH1, PTEN, TP53
3. Likely	BARD1, BRIP1, FANCC, FANCM, NF1, RAD51C,
	RAD51D
4. Suggestive	AKT1, MEN1, MSH6, NBN, PIK3CA, RECQL, STK11
5. Unlikely	ATR, EPCAM, FAM175A, GEN1, MLH1, MRE11A,
	MSH2, MUTYH, PMS2, PPM1D, RAD50, RINT1,
	XRCC2

* 1: association has been demonstrated in multiple publications; 2: familial cancer syndromes in which breast cancer is a linked feature; 3: some controversy among studies, but metaanalyses positive; 4: a few positive studies, but no firm replication yet; 5: anecdotal evidence, or studies controversial

Supplementary Table 2 Overview of the SNPs included in the polygenic risk score

SNP	NP Ref Alt		OR*	Beta**	
rs616488	A G		0.94	-0.06	
rs2992756	Т	С	0.94	-0.06	
rs4233486	С	Т	1.03	0.03	
rs79724016	Т	G	0.93	-0.07	
rs1707302	А	G	1.04	0.04	
rs140850326	Del	Ins	0.97	-0.03	
rs17426269	G	А	1.05	0.05	
rs12022378	С	Т	1.04	0.04	
rs7529522	Т	С	1.06	0.06	
rs11249433	А	G	1.11	0.10	
rs12405132	С	Т	0.97	-0.03	
rs12048493	А	С	1.04	0.04	
rs4971059	G	А	1.05	0.05	
rs35383942	С	Т	1.12	0.11	
rs11117758	G	А	0.95	-0.05	
rs72755295	А	G	1.15	0.14	
rs113577745	С	G	1.08	0.08	
rs12710696	Т	С	0.97	-0.03	
rs6725517	А	G	0.96	-0.04	
rs3833441	Del	Ins	1.09	0.09	
rs4849887	Т	С	1.10	0.09	
rs2016394	G	А	0.95	-0.05	
rs1550623	G	А	1.05	0.05	
rs1830298	С	Т	0.94	-0.06	
rs34005590	С	А	0.82	-0.20	
rs4442975	G	Т	0.89	-0.12	
rs16857609	С	Т	1.06	0.06	
rs12479355	А	G	0.96	-0.04	
rs6762644	А	G	1.05	0.05	
rs4973768	С	Т	1.11	0.10	
rs12493607	G	С	1.05	0.05	
rs6796502	G	А	0.92	-0.08	
rs1053338	А	G	1.05	0.05	
rs6805189	Т	С	0.97	-0.03	
rs13066793	А	G	0.94	-0.06	
rs9833888	G	Т	1.06	0.06	
rs34207738	Del	Ins	1.06	0.06	
rs58058861	G	А	1.06	0.06	

rs6815814	А	С	1.06	0.06
rs10718573	Ins	Del	0.96	-0.04
rs10022462	С	Т	1.04	0.04
rs9790517	С	Т	1.04	0.04
rs77528541	G	Т	0.95	-0.05
rs6828523	С	А	0.91	-0.09
rs116095464	Т	С	1.06	0.06
rs3215401	Del	Ins	0.93	-0.07
rs10069690	С	Т	1.06	0.06
rs2012709	С	Т	1.02	0.02
rs10941679	А	G	1.15	0.14
rs62355902	А	Т	1.18	0.17
rs10472076	Т	С	1.03	0.03
rs1353747	Т	G	0.96	-0.04
rs72749841	Т	С	0.93	-0.07
rs35951924	Del	Ins	0.95	-0.05
rs7707921	Т	А	1.06	0.06
rs10474352	С	Т	0.94	-0.06
rs6882649	G	Т	1.03	0.03
rs6596100	С	Т	0.94	-0.06
rs1432679	С	Т	0.93	-0.08
rs4562056	G	Т	1.05	0.05
rs204247	G	А	0.96	-0.04
rs3819405	С	Т	0.96	-0.04
rs2223621	s2223621 T		0.96	-0.04
rs71557345	rs71557345 G		0.92	-0.08
rs17529111	rs17529111 T C		1.02	0.02
rs12207986	G	А	1.03	0.03
rs3757322	Т	G	1.08	0.08
rs9397437	G	А	1.17	0.16
rs2747652	Т	С	1.06	0.06
rs6569648	s6569648 C T		1.06	0.06
rs7971	А	G	0.96	-0.04
rs17156577	Т	С	1.05	0.05
rs6964587	G	Т	1.03	0.03
rs17268829	Т	С	1.05	0.05
rs71559437	G	А	0.93	-0.07
rs4593472	С	Т	0.97	-0.03
rs11977670	G	А	1.06	0.06
rs720475	G	А	0.96	-0.04
rs9693444	А	С	0.94	-0.06
rs13365225	А	G	0.91	-0.09

rs6472903	G	Т	1.06	0.06
rs2943559	А	G	1.10	0.10
rs514192	А	Т	0.95	-0.05
rs12546444	А	Т	0.93	-0.07
rs13267382	А	G	0.97	-0.03
rs58847541	G	А	1.08	0.08
rs13281615	А	G	1.11	0.10
rs11780156	С	Т	1.05	0.05
rs1011970	G	Т	1.07	0.07
rs10759243	С	А	1.06	0.06
rs676256	С	Т	1.10	0.09
rs10816625	А	G	1.11	0.10
rs13294895	С	Т	1.06	0.06
rs1895062	А	G	0.94	-0.06
rs10760444	G	А	0.97	-0.03
chr9:136151579	Ins	Del	1.03	0.03
rs67958007	Ins	Del	1.09	0.09
rs7072776	А	G	0.95	-0.05
rs11814448	А	С	1.12	0.11
rs10995201	А	G	0.90	-0.11
rs704010	Т	C	0.03	-0.07
13/07010	1	C	0.75	-0.07
rs140936696	Ins	Del	0.96	-0.07
rs140936696 rs7904519	Ins A	Del G	0.95 0.96 1.03	-0.04 0.03
rs140936696 rs7904519 rs11199914	Ins A C	Del G T	0.96 0.96 1.03 0.96	-0.04 0.03 -0.04
rs140936696 rs7904519 rs11199914 rs35054928	Ins A C Ins	Del G T Del	0.96 1.03 0.96 0.79	-0.04 -0.04 -0.04 -0.24
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563	Ins A C Ins A	Del G T Del T	0.96 1.03 0.96 0.79 1.23	-0.04 -0.04 0.03 -0.04 -0.24 0.21
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578	Ins A C Ins A C	Del G T Del T T	0.96 1.03 0.96 0.79 1.23 0.81	-0.04 -0.04 -0.04 -0.24 0.21 -0.21
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198	Ins A C Ins A C T	Del G T Del T T C	0.96 1.03 0.96 0.79 1.23 0.81 1.05	-0.04 -0.04 -0.04 -0.24 0.21 -0.21 0.05
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981	Ins A C Ins A C T A	Del G T Del T T C G	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04	-0.04 -0.04 0.03 -0.04 -0.24 0.21 -0.21 0.05 0.04
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072	Ins A C Ins A C T A G	Del G T Del T T C G T	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97	-0.04 -0.04 0.03 -0.04 0.024 0.21 -0.21 0.05 0.04
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219	Ins A C Ins A C T A G C	Del G T Del T T C G T G	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21	-0.04 0.03 -0.04 0.03 -0.24 0.21 -0.21 0.05 0.04 -0.03 0.19
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342	Ins A C Ins A C T A G C C	Del G T Del T T C G T G A	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28	$\begin{array}{c} -0.04 \\ \hline 0.03 \\ -0.04 \\ \hline 0.24 \\ \hline 0.21 \\ -0.21 \\ \hline 0.05 \\ \hline 0.04 \\ -0.03 \\ \hline 0.19 \\ \hline 0.25 \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646	Ins A C Ins A C T A G C C T	Del G T Del T T C G G T G A C	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04	$\begin{array}{c} -0.07 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552	Ins A C Ins A C T A G C C T G	Del G T Del T T C G G T G A C C	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 1.04	$\begin{array}{c} -0.07 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051	Ins A C Ins A C T A G C C T G C	Del G T Del T T C G G T G A C C T	0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97	$\begin{array}{c} -0.07 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \\ -0.12 \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448	Ins A C Ins A C T A G C C T G C T	Del G T Del T T C G G T G A C C T C	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.89 0.95	$\begin{array}{c} -0.04 \\ \hline 0.03 \\ -0.04 \\ \hline 0.24 \\ \hline 0.21 \\ -0.21 \\ \hline 0.05 \\ \hline 0.04 \\ -0.03 \\ \hline 0.19 \\ \hline 0.25 \\ \hline 0.04 \\ \hline 0.06 \\ -0.12 \\ -0.05 \\ \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448 rs17356907	Ins A C Ins A C T A G C C T G C T A	Del G T Del T C G G T G A C C T C T C G	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97 0.97 0.97 0.97 0.97 0.97 0.97 0.97 0.97 0.97 0.97 0.91	$\begin{array}{c} -0.04 \\ \hline 0.03 \\ -0.04 \\ \hline 0.04 \\ -0.24 \\ \hline 0.21 \\ -0.21 \\ \hline 0.05 \\ \hline 0.05 \\ \hline 0.04 \\ -0.03 \\ \hline 0.19 \\ \hline 0.25 \\ \hline 0.04 \\ \hline 0.06 \\ -0.12 \\ -0.05 \\ -0.09 \\ \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448 rs17356907 rs1292011	Ins A C Ins A C T A G C C T G C T A A A	Del G T Del T T C G G A C C T C C G G G	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97 0.95 0.95 0.91 0.92	$\begin{array}{c} -0.07 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \\ -0.12 \\ -0.05 \\ -0.09 \\ -0.08 \\ \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448 rs17356907 rs1292011 rs206966	Ins A C Ins A C T A G C C T G C T A A C	Del G T Del T T C G G T G G C T C G G G T	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.05 0.91 0.92 1.05	$\begin{array}{c} -0.04 \\ 0.03 \\ -0.04 \\ 0.03 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \\ -0.12 \\ -0.05 \\ -0.09 \\ -0.08 \\ 0.05 \\ \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448 rs17356907 rs1292011 rs206966 rs11571833	Ins A C Ins A C T A G C C T G C T G C T A A A C	Del G T Del T C G G C T C C T C C G G G T T T	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 1.05 0.91 0.92 1.05 1.35	$\begin{array}{c} -0.07 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \\ -0.12 \\ -0.05 \\ -0.09 \\ -0.08 \\ 0.05 \\ 0.30 \\ \end{array}$
rs140936696 rs7904519 rs11199914 rs35054928 rs45631563 rs2981578 rs3817198 rs6597981 rs3903072 rs554219 chr11:69088342 rs11820646 rs12422552 rs7297051 rs202049448 rs17356907 rs1292011 rs206966 rs11571833 rs6562760	Ins A C Ins A C T A C T A C T A C T A C T A C T A C A C A C A A A A A A A A A A	Del G T Del T C G T G T G T G T G T G G G G T G T G T G	0.96 1.03 0.96 1.03 0.96 0.79 1.23 0.81 1.05 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 0.97 1.21 1.28 1.04 1.05 0.91 0.92 1.05 1.35 1.05	$\begin{array}{c} -0.04 \\ -0.04 \\ 0.03 \\ -0.04 \\ -0.24 \\ 0.21 \\ -0.21 \\ 0.05 \\ 0.04 \\ -0.03 \\ 0.19 \\ 0.25 \\ 0.04 \\ 0.06 \\ -0.12 \\ -0.05 \\ -0.09 \\ -0.08 \\ 0.05 \\ 0.30 \\ 0.05 \\ \end{array}$

rs2588809	Т	С	0.94	-0.06
rs999737	С	Т	0.91	-0.09
rs941764	А	G	1.03	0.03
rs11627032	Т	С	0.96	-0.04
rs10623258	Del	Ins	1.04	0.04
rs2290203	G	А	0.94	-0.06
rs4784227	С	Т	1.23	0.21
rs17817449	Т	G	0.95	-0.05
rs11075995	А	Т	0.97	-0.03
rs28539243	G	А	1.05	0.05
rs2432539	А	G	0.97	-0.03
rs13329835	А	G	1.07	0.07
rs4496150	С	Α	0.96	-0.04
rs146699004	Ins	Del	0.97	-0.03
rs72826962	С	Т	1.20	0.18
chr17:44252468	G	Α	0.95	-0.05
rs2787486	Α	С	0.93	-0.07
rs745570	А	G	1.05	0.05
rs527616	С	G	1.03	0.03
rs1436904	Т	G	0.95	-0.05
rs117618124	Т	С	0.89	-0.12
rs6507583	А	G	0.92	-0.08
rs78269692	Т	С	1.09	0.09
rs2594714	G	А	0.97	-0.03
rs2965183	G	А	1.04	0.04
chr19:17262404	С	G	1.03	0.03
rs4808801	Α	G	0.93	-0.07
rs71338792	Del	Ins	1.05	0.05
rs3760982	А	G	0.95	-0.05
rs16991615	G	Α	1.10	0.10
rs6122906	Α	G	1.05	0.05
rs2823093	G	Α	0.94	-0.06
rs17879961	Α	G	1.26	0.23
rs132390	С	Т	0.96	-0.04
rs6001930	Т	С	1.12	0.11
rs738321	С	G	0.95	-0.05
rs73161324	С	Т	1.06	0.06
rs28512361	G	A	1.05	0.05

*odds ratios (OR) for the alternative (Alt) allele derived from Michailidou et al. 2017[12], ** beta for the Alt allele calculated based on the ORs from Michailidou et al. 2017[12]

Supplementary Table 3 Rare missense variants found in the regions where the sibships share two haplotypes

Gene	Family	Variant (coding DNA)	Variant (protein)	Rs-number	Frequency*	CADD
SERINC2	RF4	c. 364C>T	p.R126W	rs183001614	0.0053	19.010
ZNF717	RF7	c.188T>A	p.H63L	rs201105907	0.0001	0.015

* Frequency in GnomAD[13] Accession numbers for the transcripts and protein sequences used to describe the variants can be found in Supplementary table 1



















RF10

RF11

RF13

RF17

2















0

-0 О 2 4 L Н EH Н 2 ¢ c B45 B47 B43 -1.11 -0.83 -0.57

RF18

0.65

0.73

0.80

RF19

O



RF20



10



Supplementary Figure 1. Pedigrees of the families included in this studyH indicates that an individual's germline DNA was haplotyped, EH indicates that an individual's germline DNA was both haplotyped and exome sequenced. Under each affected individual for whom germline DNA was available the normalized PRS and OR (in italics) are indicated. The * -symbol indicates individuals carrying the CHEK2*1100delC variant.B= breast cancer, BI= bladder cancer, Br= brain cancer, C= colon cancer, Ca= cancer not otherwise specified, Cx= cervical cancer, E= esophagus cancer, Hy= hypophysis cancer, L= lung cancer, Leu= leukemia, Li= liver cancer, Ly= lymphoma (not specified), M= melanoma, NHL= non-Hodgkin lymphoma, P= Prostate cancer, Pa= pancreas cancer, Re= renal cancer, S= stomach cancer, Sk = skin cancer (not specified), T= testicular cancer, Th= thyroid cancer.

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