



Published in final edited form as:

*Breast Cancer Res Treat.* 2011 January ; 125(1): 207–214. doi:10.1007/s10549-010-0947-3.

## Comprehensive screen of genetic variation in DNA repair pathway genes and postmenopausal breast cancer risk

Genevieve M. Monsees<sup>1,3</sup>, Peter Kraft<sup>1,4</sup>, Stephen J. Chanock<sup>5</sup>, David J. Hunter<sup>1,3,6</sup>, and Jiali Han<sup>1,2,3,\*</sup>

<sup>1</sup> Program in Molecular and Genetic Epidemiology, Department of Epidemiology, Harvard School of Public Health, 665 Huntington Ave., Boston, MA 02115, USA

<sup>2</sup> Department of Dermatology, Brigham and Women's Hospital, 181 Longwood Ave., Boston, MA 02115

<sup>3</sup> Channing Laboratory, Department of Medicine, Harvard Medical School, 181 Longwood Ave., Boston, MA 02115, USA

<sup>4</sup> Department of Biostatistics, Harvard School of Public Health, 665 Huntington Ave., Boston, MA 02115, USA

<sup>5</sup> Division of Cancer Epidemiology and Genetics, National Cancer Institute, National Institutes of Health, Department of Health and Human Services, Bethesda, MD, USA

<sup>6</sup> Department of Nutrition, Harvard School of Public Health, 665 Huntington Ave., Boston, MA 02115, USA

### Abstract

**Purpose**—Mistakes in DNA repair can result in sustained damage and genetic instability. We comprehensively evaluated common variants in DNA repair pathway genes for their association with postmenopausal breast cancer risk with and without respect to estrogen receptor (ER) and progesterone receptor (PR) subtypes.

**Methods**—In this nested case-control study of 1,145 prospectively ascertained breast cancer cases and 1,142 matched controls within the Nurses' Health Study Cancer Genetic Markers of Susceptibility project, we evaluated 1,314 common genetic variants in 68 candidate genes. These variants were chosen to represent five DNA repair pathways including base excision repair, nucleotide excision repair, double strand break repair (homologous recombination and non-homologous end-joining), direct reversal repair, and mismatch repair, along with candidate DNA polymerases, Fanconi Anemia complementation groups, and other genes relevant to DNA damage recognition and response. Main effects, pathway effects and pair-wise interactions were evaluated using Logistic Regression, and the Admixture Maximum Likelihood (AML) and Kernel Machine tests.

**Results**—Eight loci in linkage disequilibrium within the XRCC4 gene were associated with susceptibility to PR– breast cancer in main effect analyses (p-values corrected for multiple testing at the within-gene level <0.04). These loci drove the association between the non-homologous end-joining pathway, containing XRCC4, and PR– breast cancer (Admixture Maximum Likelihood p-value for the full pathway=0.002; p-value when the eight loci were removed=0.86). We performed the Kernel machine analysis to test the hypothesis of no linear or quadratic effects

\* corresponding author (jiali.han@channing.harvard.edu).

for any of the tested SNPs, or any SNP-SNP interactions among them, including those SNPs in XRCC4, and yielded a p-value of 0.85.

**Conclusions**—These findings suggest that common variation alone in DNA repair genes plays at most a small role in determining postmenopausal breast cancer risk among women of European ancestry, and support the theory that redundancies in DNA repair mechanisms may be compensatory.

## Keywords

Polymorphism; DNA repair; Breast cancer; Postmenopausal women; Pathway

## 1 Introduction

Breast cancer is the most common type of cancer and the second leading cause of cancer death among women in the United States. While family history of breast cancer is an established predisposing factor, epidemiological studies suggest that only 5–10% of breast cancer cases are familial and the remaining proportion is sporadic [1]. The majority of genetic variants that influence susceptibility to sporadic breast cancer are unknown [2]. Common variants may explain a greater proportion of breast cancer morbidity and mortality than rare highly penetrant mutations, such as those in BRCA1 and BRCA2 which account for only 15–20% of familial breast cancer cases[1].

DNA repair plays an essential role in the maintenance of DNA integrity. Failure of DNA repair mechanisms can lead to sustained damage, potentially resulting in the malfunction of cellular systems and checkpoints, and the ability of a cell to over-proliferate or evade apoptosis. Deficient DNA repair capacity has been suggested as a predisposing factor in familial and sporadic breast cancer [3–5]. Substantial correlations have been found between DNA repair gene variants and DNA repair capacity[6]. Several studies have observed a low nucleotide excision repair capacity and direct reversion repair capacity of breast tissue [7–9] and suggest that the breast epithelium may uniquely lack redundant systems of double-strand break repair that are present in other tissues [10,11]. If true, this suggests common genetic variation in DNA repair genes would have greater impact in breast tissues than other tissues with more extensive DNA repair redundancy.

Despite the relevance of DNA repair to carcinogenesis, the impact of common genetic variation on postmenopausal breast cancer susceptibility is not fully understood. In this case-control study of 2,287 postmenopausal women of European ancestry (1,145 cases and 1,142 controls matched on age and postmenopausal hormone use) nested within the Nurses' Health Study (NHS), we comprehensively and systematically evaluated genetic variation in the coding and non-coding regions of 68 DNA repair genes in relation to invasive postmenopausal breast cancer risk. The association between breast cancer risk and each of these markers individually was assessed as part of the Cancer Genetic Markers of Susceptibility (CGEMS) Project, although none reached conventional genome-wide significance in the initial scan [12] and only one reached genome-wide significance (rs999737 within RAD51L1) after extensive follow-up [13]. Here we present the results for these markers adjusted for multiple testing at the gene, rather than the genome-wide level. We also explore the possibility that markers in DNA repair pathways may be collectively associated with risk of breast cancer even though the association between breast cancer and any particular marker is too weak to detect. To this end, we conduct a test that aggregates evidence for association across multiple markers (the Admixture Maximum Likelihood test (AML)) and a test that explicitly allows for non-additive interactions among markers in the same pathway (the Kernel Machine test).

These pathways/genes included direct reversion repair (MGMT), base excision repair (BER) (ADPRT, APEX1, FEN1, LIG1, LIG3, NEIL1, NEIL2, OGG1, PCNA, UNG2, XRCC1), nucleotide excision repair (NER) (CKN1, ERCC1, ERCC2, ERCC3, ERCC4, ERCC5, ERCC6, RAD23a, RAD23b, RPA1, RPA2, RPA3, XPA, XPC), double-strand break (DSB) repair via (a) homologous recombination (HR) (BRCA1, BRCA2, MRE11A, NBS1, RAD50, RAD51, RAD51c, RAD51L1, RAD51L3, RAD52, RAD54L, XRCC2, XRCC3), or (b) non-homologous end-joining (NH) (DCLRE1C, G22P1, LIG4, PRKDC, XRCC4, XRCC5), mismatch repair (MMR) (MLH1, MLH3, MSH2, MSH3, MSH6, PMS1, PMS2), DNA polymerases (POL) (POLB, POLD1, POLE, POLI, POLK), Fanconi Anemia complementation groups (FAN) (FANCA, FANCC, FANCD2, FANCE, FANCF, FANCG), and DNA damage recognition and response (REG)(ATM, ATR, CHEK1, CHEK2, TP53).

Breast cancer tumors are heterogeneous across ER and PR status with respect to tumor characteristics, response to treatment, and risk profiles [14–17]. In this study we investigate overall breast cancer susceptibility as well as ER and PR subtype specific susceptibility. Preliminary reports suggest that categorization into ER and PR subtypes may be particularly useful when studying the etiology of breast cancer with respect to DNA repair [18–22].

## 2 Materials and Methods

### 2.1 Population

This study population is nested within the Nurses' Health Study (NHS) Cancer Genetic Markers of Susceptibility (CGEMS) breast cancer case-control study (described elsewhere [12]). Participants provided a blood sample (between 1989 and 1990), were free of diagnosed breast cancer at blood collection, and followed for incident disease until May 2004. Controls were matched to cases based on age, blood collection variables (time, date, and year of blood collection, as well as recent (<3 months) use of postmenopausal hormones (PMH)). The analysis was restricted to women of self-reported European ancestry (with no substantial genetic evidence of non-European ancestry) who were menopausal at blood draw. Informed consent was obtained from all participants. The study was approved by the Institutional Review Board of the Brigham and Women's Hospital, Boston, MA, USA.

Here we investigate the 1,314 CGEMS tag SNPs which had a minor allele frequency (MAF)>0.01 among controls and were located within 30Kb upstream or downstream of 68 genes chosen to represent the above-mentioned five DNA repair pathways, candidate DNA polymerases, Fanconi Anemia complementation groups, and genes relevant to DNA damage recognition and response. These SNPs were selected from the 528,173 genome-wide-tagging SNPs genotyped successfully among 1,145 CGEMS cases and 1,142 controls. Detailed methods for the CGEMS genome wide association study have been previously reported [12].

### 2.2 Analysis of main effect

The main effect of each SNP on invasive breast cancer susceptibility was estimated using unconditional logistic regression, adjusted for matching factors (four indicators of age quartile, PMH use (Yes/No)) and three eigenvectors previously shown to be effective in reducing population stratification in this cohort [12]. All SNPs were modeled additively using their minor allele count. Two-sided p-values were calculated for each SNP. Measures of linkage disequilibrium ( $r^2$ ) presented for genotyped SNPs within a gene were calculated among the controls.

### 2.3 Correction for multiple testing

The Bonferroni correction, which divides the type I error rate ( $\alpha$ ) by the total number of tests performed, is overly conservative in the presence of linkage disequilibrium (LD); tests of SNPs in LD cannot be considered independent tests as their outcomes will be correlated. We apply the method proposed by Gao et al. [23] to estimate the effective number of independent tests ( $M_{\text{eff},i}$ ) for each gene  $i$ . To obtain a gene specific corrected type I error rate we substitute this value into the standard Bonferroni correction in place of the total number of SNPs ( $\alpha/M_{\text{eff},i}$ ). P-values for main effects analyses are presented as both uncorrected and  $M_{\text{eff},i}$  corrected p-values ( $p_{\text{corrected}}=p_{\text{uncorrected}}*M_{\text{eff},i}$ ). The sum of the  $M_{\text{eff},i}$  over the 68 genes studied was 862.

### 2.4 Pathway analyses

**2.4.1 Admixture Maximum Likelihood test**—For each of the five DNA repair pathways and the three additional categories of genes important to DNA repair, we applied Admixture Maximum Likelihood (AML) [24]. AML estimates the proportion of associated SNPs and their typical effect size to test the global null hypothesis of no association between any SNP and breast cancer susceptibility within the pathway. 1,000 permutations were used to estimate the AML p-values for trend. Due to computational limitations AML analyses were not adjusted for covariates. However, the minimum estimated p-values obtained for each SNP when using this method were similar to those obtained in the above covariate-adjusted main effects analyses. The NH and HR double strand break repair pathways were analyzed separately.

**2.4.2 Kernel machine test**—Kernel machine analyses [25] were conducted using a quadratic kernel to test the hypothesis of no linear or quadratic effects for any of the tested SNPs, or any SNP-SNP interactions among them. This analysis is equivalent to fitting a mixed model and testing whether the variance of the random effects  $\tau^2=0$ . The mixed model is:

$$\log\left(\frac{p_i}{1-p_i}\right)=\beta' \mathbf{X}+\sum_l \gamma_l G_{il}+\sum_{l,k} \gamma_{lk} G_{il} G_{ik},$$

where  $p_i$  is the probability individual  $i$  has breast cancer;  $\mathbf{X}$  is a vector of observed covariates (including an intercept) and  $\beta$  a vector of their fixed effects;  $G_{ij}$  is the genotype at SNP  $j$  for individual  $i$ , coded additively (0, 1, or 2 counts of the minor allele);  $\gamma_j$  and  $\gamma_{ij}$  are independent random effects, each distributed as  $N(0,\tau^2)$ . The kernel defines a similarity matrix among subjects based on their genotypes; the quadratic kernel used here was  $K(\mathbf{G}_i,\mathbf{G}_j)=(1+\mathbf{G}_i'\mathbf{G}_j)^2$ .

Due to computational intensity only those SNPs with a raw p-value less than 0.05 in the covariate-adjusted single SNP analyses were fed into the kernel machine. Because restricting the analysis to univariately significant SNPs can downwardly bias p-values, we used permutation to assess statistical significance (1,000 permutations). The complete case approach was used to handle missing data; to verify the appropriateness of the complete case approach, the kernel analysis was repeated after filling in missing genotypes with imputed CGEMS data, and a similar result was obtained. The imputation methods applied are described elsewhere [26].

### 2.5 Breast cancer subtype analyses

Main effect and pathway analyses were repeated classifying invasive breast cancer cases according to their ER or PR status, and comparing them to non-cases. ER and PR status

were available from pathology reports for a subset of the 1,145 breast cancer cases (ER+ cases: 807, ER- cases: 181, PR+ cases: 666, PR- cases: 297). AML analyses were performed using AMLcalc [24]; all other analyses including the calculation of  $M_{\text{eff},i}$  were performed using R 2.8.0 [27].

### 3 Results

#### 3.1 Analysis of main effect

Table 1 lists, by outcome of interest (any breast cancer, ER+, ER-, PR+, PR-), all common variants with a  $M_{\text{eff},i}$  corrected p-value less than 0.05 in the main effects analysis using unconditional logistic regression adjusted for matching factors (age, PMH use) and population structure. Given the total number of effective tests performed per outcome in the main effects analysis ( $\Sigma M_{\text{eff},i} = 862$ ) one would expect 43  $M_{\text{eff},i}$  corrected p-values to exceed this 0.05 threshold per outcome when the null hypothesis of no association is true ( $862 \times 0.05 = 43.1$ ).  $M_{\text{eff},i}$  adjusted p-values presented represent a gene-level correction and do not take into account the number of genes or outcomes tested.

Two SNPs exceeded the corrected threshold with respect to Breast Cancer susceptibility. Rs6151838, an intronic variant within *MSH3* (member of the MMR pathway), had a  $M_{\text{eff},MSH3}$  adjusted p-value of 0.048. Rs17136898, an intronic variant within *RPA3* (member of the NER pathway), had a  $M_{\text{eff},RPA3}$  adjusted p-value of 0.046. This *RPA3* variant was also associated with ER- breast cancer ( $M_{\text{eff},RPA3}$  adjusted p-value = 0.007) and PR+ breast cancer ( $M_{\text{eff},RPA3}$  adjusted p-value = 0.038).

Two intronic SNPs (rs274860 and rs2304136) within *LIG1* (a member of the BER pathway) had  $M_{\text{eff},LIG1}$  adjusted p-values <0.05 for association with both ER+ and PR+ breast cancer susceptibility. These two SNPs are in high LD ( $r^2=0.84$ ). Rs274860 had the smaller set of p-values (ER+:  $M_{\text{eff},LIG1}$  adjusted p-value = 0.006; PR+:  $M_{\text{eff},LIG1}$  adjusted p-value =0.013).

In addition to the previously mentioned *LIG1* and *RPA3* associations, three SNPs exceeded their corrected gene specific threshold for association with PR+ breast cancer. Rs12805507 and rs408199, both had a  $M_{\text{eff},FANCF}$  adjusted p-value of 0.009. They are intergenic SNPs in high LD ( $r^2=0.89$ ) located near FAN gene *FANCF*. Rs5743030, an intronic SNP within *PMS1* (a member of the MMR pathway) had  $M_{\text{eff},PMS1}$  adjusted p-value of 0.047).

Five SNPs exceeded their corrected gene-specific threshold for association with ER- breast cancer. *RPA3* contained three associated SNPs including rs17136898 (previously mentioned) and two additional associated SNPs (rs13237260 and rs10952069; intergenic SNPs in high LD located downstream of *RPA3* ( $r^2=0.96$ )). Some LD exists between rs17136898 and rs13237260 ( $r^2=0.69$ ) and between rs17136898 and rs10952069 ( $r^2=0.68$ ). Rs13237260 had the lowest  $M_{\text{eff},RPA3}$  adjusted p-value (0.007). *POL* gene *POLE* contained a missense SNP (rs5745066) with  $M_{\text{eff},POLE}$  adjusted p-value of 0.027. *APEX1*, of the BER pathway contained intronic SNP rs2275008 which had a  $M_{\text{eff},APEX1}$  adjusted p-value of 0.033.

Eight of the nine SNPs with  $M_{\text{eff}}$  adjusted p-values < 0.05 for their association with risk of PR- breast cancer reside on *XRCC4*, a key player in the NH pathway. Fig. 1 depicts r-square values or SNPs on *XRCC4* and their corresponding p-values for the PR-analysis. It suggests that the large number of associated SNPs on *XRCC4* may be due to high LD (the smallest  $M_{\text{eff},XRCC4}$  adjusted p-value observed was 0.012). The 9<sup>th</sup> SNP to exceed the corrected threshold is rs12572872, and intronic SNP within *DCLRE1C*, also residing within the NH pathway ( $M_{\text{eff},DCLRE1C}$  adjusted p-value =0.020).

### 3.2 Pathway analyses

None of the pathways or groupings of DNA repair related genes, tested using AML, appeared associated with susceptibility to breast cancer independent of ER or PR status. Raw p-values for trend for all AML analyses are presented in Table 2, uncorrected for the number of pathways or outcomes tested. BER appeared mildly associated with ER+ and PR + breast cancer (p-values of 0.032 and 0.049 respectively), as did NER with ER- breast cancer (p-value=0.048). However, none of these associations are strong enough to survive a multiple testing correction for the number of pathways investigated. The NH association with PR- breast cancer is strong enough to survive a multiple testing correction (p-value=0.002). To examine whether this NH pathway effect is driven by the multitude of highly linked SNPs on *XRCC4*, we repeated the analysis excluding the eight associated *XRCC4* SNPs, and obtained a p-value of 0.86.

**3.2.1 SNP\*SNP interaction**—916 of the 1,000 kernel permutations had a p-value more extreme than that observed in our data, therefore we cannot reject the null hypothesis that there are no main effects or pair-wise SNP-SNP interactions (p=0.92). To assess whether it was appropriate to apply a complete case approach, the same analysis was repeated using the imputed CGEMS data, and a similar result was obtained (permutation p-value=0.85).

## 4 Discussion

Specific types of DNA damage trigger a repair response from specific DNA repair pathways. For example, the BER pathway responds to a wide variety of non-bulky exogenous and endogenous oxidative DNA damage and single strand breaks [28] while the NER pathway is a versatile repair system to remove a wide variety of bulky, helix-distorting lesions and adducts [29,30]. Therefore, considering common genetic variants individually may mask biologically relevant pathway effects. We applied AML and Kernel machine analyses to examine the effect of common genetic variation at the pathway level.

In addition to five traditional DNA repair pathways, we considered Fanconi Anemia complementation group genes and DNA polymerases for their role in DNA repair. FAN genes interact with DNA-damage response proteins and other proteins related to cellular responses to carcinogenic stress and to caretaker and gatekeeper functions. The products of POL genes are specialized for operation in distinct DNA repair pathways, or for bypass of specific classes of adducts in DNA [31]. To our knowledge this study is the most exhaustive investigation to date into pathway effects of DNA repair related genes with respect to breast cancer.

In this study we have presented a comprehensive screen of the effect of common variation within a broader range of DNA repair genes than has, to our knowledge, been previously studied on breast cancer and specifically invasive postmenopausal breast cancer. Additionally this study builds on previous work [32,33] by considering the potential impact of full pathways and pairwise interaction. We have also examined the relevance of each SNP and pathway with and without respect to ER and PR subtypes -acknowledging the heterogeneity of breast cancer and allowing detection for subtype specific effects that may not be noticeable when pooling all breast cancer cases together.

We observed no more independent associations than would be expected by chance. Thus it is probable that most if not all of our observed nominally significant associations are likely to be false positive results. However, the identity of false positive and the false negative results cannot be discerned from our data. Replication is essential in studies of large numbers of common variants to identify the true nature of each SNP's association.

SNP rs999737 within RAD51L1, a gene on the NH pathway, achieved genome-wide significance in the third stage of the CGEMS initiative [13] ( $p$ -value =  $1.74 \times 10^{-7}$ ;  $OR_{\text{heterozygote}} = 0.94$  (95% CI: 0.88–0.99)). In this study we observed rs999737 to have an uncorrected  $p$ -value of 0.012. We have not found evidence of common variants with large effects; however, our study is underpowered to detect modest effects and we may therefore lack the ability to detect individual SNPs with small effects.

Due to the number of tests performed in our analysis, one ought to anticipate a high degree of false positive test results in the absence of appropriate statistical controls. We applied a correction for multiple testing to reduce false positive associations that takes into account LD structure in determining the number of effective tests. Many of the SNPs which exceeded our corrected threshold at the gene level were in high LD with one another and therefore each cluster of LD was likely explaining a single underlying haplotype.

We have previously investigated the association between 1,050 common variants in 60 DNA repair genes and pre-menopausal breast cancer risk among 239 cases and 477 matched controls within the Nurses' Health Study II [33]. Within these premenopausal women, we found suggestive evidence that common variants in XPF and XRCC3 genes may influence risk, as well as common variation in the NH pathway.

Haiman et al. [32] investigated common genetic variation in 60 genes from within the same set of pathways using the Multiethnic Cohort Study (MEC). This analysis utilized the genotypes for 1367 tag SNPs from 2,093 breast cancer cases and 2,303 controls stemming from five ethnic sub-populations to identify candidate loci. The study sought replication of 15 tag SNPs in three populations of varying ethnic composition including the NHS to identify "pan-ethnic" alleles. The authors observed a lack of replication when comparing United States and United Kingdom study populations.

Both of the above studies investigated pathway effects by studying whether an increased count of variant alleles within a pathway was correlated with increased breast cancer susceptibility. Our study utilizes a more inclusive set of tag SNPs, and more comprehensive pathway approach to investigate this question in greater detail.

Our observations support the general conclusions and lack of replication between the majority of the previous studies into common variation within DNA repair genes. They suggest that when not taking into account environmental interaction, common variation in DNA repair genes plays at most a small role in determining postmenopausal invasive breast cancer risk among American women of European ancestry.

While mutations in key DNA repair genes (for example BRCA1, BRCA2, ATM) have been found to have a major impact on breast cancer risk, it is understandable that the tangible impact of common variation in these genes could be low due to redundant repair systems compensating for one another. Breast tissue is thought to lack redundancy relative to other tissues; this study is consistent with the hypothesis that residual redundancies may be sufficient or that variants that markedly degrade DNA repair capacity are under selective pressure.

It is possible that environmental factors, such as antioxidant or folate deficiency, that insult the DNA or impair DNA repair capacity, may interact with common variants in DNA repair genes in a way such that the meaningful impact of the variant is only detectable when stratifying by the presence or absence of the environmental factor. Such interaction would make replication across diverse populations, as was attempted in the multiethnic study by Haiman et al. [32], unlikely if the populations geographically or temporally differ greatly with respect to environment. Further research is needed to investigate the effect of

environmental interaction on the relationship between common variation in DNA repair genes and breast cancer susceptibility.

## Acknowledgments

This project was funded by NCI grant CA118447. Genevieve Monsees was supported by PHS T32-ES016645-01. The authors would like to thank Constance Chen for preparing the data and for producing Fig. 1. We also thank the participants of the Nurses' Health Study for their dedication and commitment.

## Abbreviations

<b>BER</b>	Base excision repair
<b>CGEMS</b>	Cancer Genetic Markers of Susceptibility
<b>DIRECT</b>	Direct reversal repair
<b>DSB</b>	Double strand break repair
<b>ER</b>	Estrogen receptor
<b>FAN</b>	Fanconi anemia complementation groups
<b>HR</b>	Homologous recombination
<b>LD</b>	Linkage disequilibrium
<b>MAF</b>	Minor allele frequency
<b>MMR</b>	Mismatch repair
<b>NER</b>	Nucleotide excision repair
<b>NH</b>	Non-homologous end joining
<b>NHS</b>	Nurses' Health Study
<b>PMH</b>	Postmenopausal hormone
<b>POL</b>	Candidate DNA polymerases
<b>PR</b>	Progesterone receptor
<b>REG</b>	DNA damage recognition and response
<b>SNP</b>	Single nucleotide polymorphism

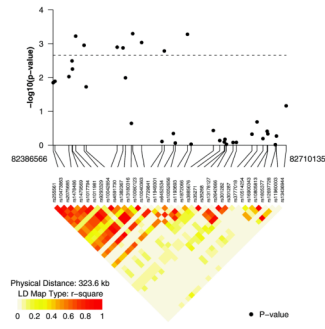
## References

1. Ponder BA. Cancer genetics. *Nature* 2001;411:336–41. [PubMed: 11357140]
2. Balmain A, Gray J, Ponder B. The genetics and genomics of cancer. *Nat Genet* 2003;33(Suppl): 238–44. [PubMed: 12610533]
3. Helzlsouer KJ, Harris EL, Parshad R, Fogel S, Bigbee WL, et al. Familial clustering of breast cancer: possible interaction between DNA repair proficiency and radiation exposure in the development of breast cancer. *Int J Cancer* 1995;64:14–7. [PubMed: 7665242]
4. Helzlsouer KJ, Harris EL, Parshad R, Perry HR, Price FM, et al. DNA repair proficiency: potential susceptibility factor for breast cancer. *J Natl Cancer Inst* 1996;88:754–5. [PubMed: 8637030]
5. Parshad R, Price FM, Bohr VA, Cowans KH, Zujewski JA, et al. Deficient DNA repair capacity, a predisposing factor in breast cancer. *Br J Cancer* 1996;74:1–5. [PubMed: 8679441]
6. Spitz MR, Wei Q, Dong Q, Amos CI, Wu X. Genetic susceptibility to lung cancer: the role of DNA damage and repair. *Cancer Epidemiol Biomarkers Prev* 2003;12:689–98. [PubMed: 12917198]



7. Fong LY, Jensen DE, Magee PN. DNA methyl-adduct dosimetry and O6-alkylguanine-DNA alkyl transferase activity determinations in rat mammary carcinogenesis by procarbazine and N-methylnitrosourea. *Carcinogenesis* 1990;11:411–7. [PubMed: 2311184]
8. Hamdan MA, Guzman RC, Yang J, Beattie C, Mascharack P, et al. Depletion of O6-alkylguanine-DNA alkyltransferase by O6-benzylguanine in three-dimensional collagen cultures of normal human breast epithelial cells. *Carcinogenesis* 1992;13:1743–9. [PubMed: 1423833]
9. Latimer JJ, Nazir T, Flowers LC, Forlenza MJ, Beaudry-Rodgers K, et al. Unique tissue-specific level of DNA nucleotide excision repair in primary human mammary epithelial cultures. *Exp Cell Res* 2003;291:111–21. [PubMed: 14597413]
10. Welch PL, Schubert EL, King MC. Inherited breast cancer: an emerging picture. *Clin Genet* 1998;54:447–58. [PubMed: 9894790]
11. Scully R, Livingston DM. In search of the tumour-suppressor functions of BRCA1 and BRCA2. *Nature* 2000;408:429–32. [PubMed: 11100717]
12. Hunter DJ, Kraft P, Jacobs KB, Cox DG, Yeager M, et al. A genome-wide association study identifies alleles in FGFR2 associated with risk of sporadic postmenopausal breast cancer. *Nat Genet* 2007;39:870–4. [PubMed: 17529973]
13. Thomas G, Jacobs KB, Kraft P, Yeager M, Wacholder S, et al. A multistage genome-wide association study in breast cancer identifies two new risk alleles at 1p11.2 and 14q24.1 (RAD51L1). *Nat Genet* 2009;41:579–84. [PubMed: 19330030]
14. Potter JD, Cerhan JR, Sellers TA, McGovern PG, Drinkard C, et al. Progesterone and estrogen receptors and mammary neoplasia in the Iowa Women's Health Study: how many kinds of breast cancer are there? *Cancer Epidemiol Biomarkers Prev* 1995;4:319–26. [PubMed: 7655325]
15. Robertson JF. Oestrogen receptor: a stable phenotype in breast cancer. *Br J Cancer* 1996;73:5–12. [PubMed: 8554983]
16. Anderson WF, Chatterjee N, Ershler WB, Brawley OW. Estrogen receptor breast cancer phenotypes in the Surveillance, Epidemiology, and End Results database. *Breast Cancer Res Treat* 2002;76:27–36. [PubMed: 12408373]
17. Colditz GA, Rosner BA, Chen WY, Holmes MD, Hankinson SE. Risk factors for breast cancer according to estrogen and progesterone receptor status. *J Natl Cancer Inst* 2004;96:218–28. [PubMed: 14759989]
18. Gonzalez R, Silva JM, Dominguez G, Garcia JM, Martinez G, et al. Detection of loss of heterozygosity at RAD51, RAD52, RAD54 and BRCA1 and BRCA2 loci in breast cancer: pathological correlations. *Br J Cancer* 1999;81:503–9. [PubMed: 10507777]
19. Skog S, He Q, Khoshnoud R, Fornander T, Rutqvist LE. Genes related to growth regulation, DNA repair and apoptosis in an oestrogen receptor-negative (MDA-231) versus an oestrogen receptor-positive (MCF-7) breast tumour cell line. *Tumour Biol* 2004;25:41–7. [PubMed: 15192311]
20. Lee KM, Choi JY, Kang C, Kang CP, Park SK, et al. Genetic polymorphisms of selected DNA repair genes, estrogen and progesterone receptor status, and breast cancer risk. *Clin Cancer Res* 2005;11:4620–6. [PubMed: 15958648]
21. Zhang SM, Hankinson SE, Hunter DJ, Giovannucci EL, Colditz GA, et al. Folate intake and risk of breast cancer characterized by hormone receptor status. *Cancer Epidemiol Biomarkers Prev* 2005;14:2004–8. [PubMed: 16103452]
22. Pedram A, Razandi M, Evinger AJ, Lee E, Levin ER. Estrogen inhibits ATR signaling to cell cycle checkpoints and DNA repair. *Mol Biol Cell* 2009;20:3374–89. [PubMed: 19477925]
23. Gao X, Starmer J, Martin ER. A multiple testing correction method for genetic association studies using correlated single nucleotide polymorphisms. *Genet Epidemiol* 2008;32:361–9. [PubMed: 18271029]
24. Tyrer J, Pharoah PD, Easton DF. The admixture maximum likelihood test: a novel experiment-wise test of association between disease and multiple SNPs. *Genet Epidemiol* 2006;30:636–43. [PubMed: 16986161]
25. Wu MC, Zhang L, Wang Z, Christiani DC, Lin X. Sparse linear discriminant analysis for simultaneous testing for the significance of a gene set/pathway and gene selection. *Bioinformatics* 2009;25:1145–51. [PubMed: 19168911]

26. Willer CJ, Speliotes EK, Loos RJ, Li S, Lindgren CM, et al. Six new loci associated with body mass index highlight a neuronal influence on body weight regulation. *Nat Genet* 2009;41:25–34. [PubMed: 19079261]
27. R Development Core Team. R: A language and environment for statistical computing. R Foundation for Statistical Computing; Vienna, Austria: 2008.
28. Memisoglu A, Samson L. Base excision repair in yeast and mammals. *Mutat Res* 2000;451:39–51. [PubMed: 10915864]
29. Wood RD. Nucleotide excision repair in mammalian cells. *J Biol Chem* 1997;272:23465–8. [PubMed: 9295277]
30. de Boer J, Hoeijmakers JH. Nucleotide excision repair and human syndromes. *Carcinogenesis* 2000;21:453–60. [PubMed: 10688865]
31. Rothwell PJ, Waksman G. Structure and mechanism of DNA polymerases. *Adv Protein Chem* 2005;71:401–40. [PubMed: 16230118]
32. Haiman CA, Hsu C, de Bakker PI, Frasco M, Sheng X, et al. Comprehensive association testing of common genetic variation in DNA repair pathway genes in relationship with breast cancer risk in multiple populations. *Hum Mol Genet* 2008;17:825–34. [PubMed: 18056155]
33. Han J, Haiman C, Niu T, Guo Q, Cox DG, et al. Genetic variation in DNA repair pathway genes and premenopausal breast cancer risk. *Breast Cancer Res Treat* 2009;115:613–22. [PubMed: 18551366]



**Fig. 1.**  $R^2$  values for SNPs on XRCC4 and their corresponding p-values from the progesterone receptor negative (PR-)breast cancer subtype analysis.

Table 1

Gene and SNP information for all SNPs with a  $M_{\text{eff}}$  adjusted p-value ( $P_{M_{\text{eff}}}$ ) less than 0.05 in a single SNP unconditional logistic regression analysis adjusted for matching factors (age, PMH use) and population structure. The outcome, breast cancer, was considered generally and with respect to estrogen receptor (ER) and progesterone receptor (PR) subtypes. (M: Total number of SNPs investigated within a gene.  $M_{\text{eff}}$ : Effective number of tests given the linkage disequilibrium pattern within a gene. OR: Odds Ratio comparing heterozygous carriers of the minor allele to non-carriers.)

Gene Name	Path	M	$M_{\text{eff}}$	rs number	OR	Raw P	$P_{M_{\text{eff}}}$	SNP Type
<b>Breast Cancer vs. No Breast Cancer</b>								
<i>RPA3</i>	NER	65	42	rs17136898	1.34	0.0011	0.046	intronic
<i>MSH3</i>	MMR	46	20	rs6151838	0.73	0.0024	0.048	intronic
<b>ER+ Breast Cancer vs. No Breast Cancer</b>								
<i>LIG1</i>	BER	30	22	rs274860	1.82	0.0003	0.006	intronic
<i>LIG1</i>	BER	30	22	rs2304136	1.63	0.0006	0.013	intronic
<b>ER- Breast Cancer vs. No Breast Cancer</b>								
<i>RPA3</i>	NER	65	42	rs13237260	1.60	0.0002	0.007	intergenic
<i>RPA3</i>	NER	65	42	rs17136898	1.73	0.0002	0.010	intronic
<i>RPA3</i>	NER	65	42	rs10952069	1.57	0.0005	0.019	intergenic
<i>POLE</i>	POL	18	10	rs5745066	2.44	0.0027	0.027	missense
<i>APEX1</i>	BER	25	21	rs2275008	1.46	0.0016	0.033	intronic
<b>PR+ Breast Cancer vs. No Breast Cancer</b>								
<i>FANCF</i>	FAN	3	3	rs12805507	0.76	0.0029	0.009	intergenic
<i>FANCF</i>	FAN	3	3	rs408199	0.77	0.0029	0.009	intergenic
<i>LIG1</i>	BER	30	22	rs274860	1.80	0.0006	0.013	intronic
<i>RPA3</i>	NER	65	42	rs17136898	0.34	0.0009	0.038	intronic
<i>LIG1</i>	BER	30	22	rs2304136	1.40	0.0020	0.045	intronic
<i>PMS1</i>	MMR	12	10	rs5743030	0.61	0.0047	0.047	intronic
<b>PR- Breast Cancer vs. No Breast Cancer</b>								
<i>XRCC4</i>	NH	34	23	rs10080123	0.71	0.0005	0.012	intronic
<i>XRCC4</i>	NH	34	23	rs1193693	0.72	0.0005	0.012	intronic
<i>XRCC4</i>	NH	34	23	rs1017794	0.72	0.0006	0.014	intronic
<i>DCLRE1C</i>	NH	15	12	rs12572872	1.38	0.0016	0.020	intronic

Gene Name	Path	M	M <sub>eff</sub>	rs number	OR	Raw P	P <sub>Meff</sub>	SNP Type
XRCC4	NH	34	23	rs10040363	0.73	0.0009	0.021	intronic
XRCC4	NH	34	23	rs1011981	0.72	0.0011	0.026	intronic
XRCC4	NH	34	23	rs10042854	0.73	0.0013	0.029	intronic
XRCC4	NH	34	23	rs4591730	0.73	0.0013	0.031	intronic
XRCC4	NH	34	23	rs11949301	0.73	0.0016	0.038	intronic

**Table 2**

Admixture maximum likelihood (AML) p-values for trend corresponding to nine pathways involved in DNA repair. The outcome, breast cancer, was considered generally and with respect to estrogen receptor (ER) and progesterone receptor (PR) subtypes.

Pathway	Genes	SNPs	BC P trend	ER+ P trend	ER- P trend	PR+ P trend	PR- P trend
BER	11	178	0.151	0.032	0.451	0.049	0.656
DIRECT	1	58	0.924	0.865	0.143	0.958	0.256
HR	13	352	0.606	0.582	0.36	0.702	0.331
FAN	6	74	0.177	0.209	0.901	0.191	0.524
MMR	7	124	0.416	0.288	0.92	0.416	0.724
NER	14	291	0.105	0.446	0.048	0.436	0.155
NH	6	109	0.93	0.946	0.43	0.553	0.002
POL	5	64	0.568	0.953	0.212	0.983	0.245
REG	5	64	0.883	0.99	0.502	0.944	0.598