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ARTICLE

Performance of the Breast Cancer Risk Assessment Tool Among Women Aged 75 Years and Older

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Abstract

Background: The Breast Cancer Risk Assessment Tool (BCRAT, "Gail model") is commonly used for breast cancer prediction; however, it has not been validated for women age 75 years and older.

Methods: We used Nurses' Health Study (NHS) data beginning in 2004 and Women's Health Initiative (WHI) data beginning in 2005 to compare BCRAT's performance among women age 75 years and older with that in women age 55 to 74 years in predicting five-year breast cancer incidence. BCRAT risk factors include: age, race/ethnicity, age at menarche, age at first birth, family history, history of benign breast biopsy, and atypia. We examined BCRAT's calibration by age by comparing expected/observed (E/O) ratios of breast cancer incidence. We examined discrimination by computing c-statistics for the model by age. All statistical tests were two-sided.

Results: Seventy-three thousand seventy-two NHS and 97 081 WHI women participated. NHS participants were more likely to be non-Hispanic white (96.2% vs 84.7% in WHI, P < .001) and were less likely to develop breast cancer (1.8% vs 2.0%, P = .02). E/O ratios by age in NHS were 1.16 (95% confidence interval [CI] = 1.09 to 1.23, age 57–74 years) and 1.31 (95% CI = 1.18 to 1.45, age \geq 75 years, P = .02), and in WHI 1.03 (95% CI = 0.97 to 1.09, age 55–74 years) and 1.10 (95% CI = 1.00 to 1.21, age \geq 75 years, P = .21). E/O ratio 95% confidence intervals crossed one among women age 75 years and older when samples were limited to women who underwent mammography and were without significant illness. C-statistics ranged between 0.56 and 0.58 in both cohorts regardless of age.

Conclusions: BCRAT accurately predicted breast cancer for women age 75 years and older who underwent mammography and were without significant illness but had modest discrimination. Models that consider individual competing risks of non–breast cancer death may improve breast cancer risk prediction for older women.

Women age 75 years and older are the fastest growing segment of the US population, and breast cancer incidence increases with age (1). However, none of the randomized trials evaluating mammography screening included women age 75 years and older. Therefore, it is not known if screening helps these women live longer (2). Ideally, screening decisions would consider an

Received: February 9, 2015; Revised: June 17, 2015; Accepted: October 20, 2015 © The Author 2015. Published by Oxford University Press. All rights reserved. For Permissions, please e-mail: journals.permissions@oup.com. older woman's breast cancer risk, life expectancy, and preferences (3,4). While there are tools to help estimate life expectancy (5) and elicit patient preferences (6), little is known about late-life breast cancer risk factors.

The Breast Cancer Risk Assessment Tool (BCRAT) is the most commonly used breast cancer risk prediction model in primary care; however, its performance among women age 75 years and older is not known (7-9). BCRAT was developed from a statistical model known as the Gail model, which was developed using data from the Breast Cancer Detection Demonstration Project (BCDDP), a study that recruited 280 000 women age 35 to 74 between 1973 and 1980 (10,11). BCRAT considers a woman's age, race/ethnicity, age at menarche, age at first live birth, number of first-degree relatives with breast cancer, number of benign breast biopsies, and history of atypical hyperplasia. However, several of these risk factors (eg, age at menarche) affect women's estrogen levels relatively early in life and may not be important for latelife breast cancer risk (4). Therefore, we aimed to assess BCRAT's performance among women age 75 years and older compared with that in postmenopausal women age 55 to 74 years participating in the Nurses' Health Study (NHS) and Women's Health Initiative (WHI). We chose these cohorts because they include many women age 75 years and older and have captured necessary data on breast cancer risk factors. Our goal was to determine BCRAT's accuracy for assessing breast cancer risk when deciding whether or not to screen women age 75 years and older for breast cancer.

Methods

BCRAT

BCRAT estimates the probability that a woman will develop invasive breast cancer in five years. To calculate risk, BCRAT considers a woman's baseline hazard of developing breast cancer based on her age and race using age (categorized into 5-year age groups) and race/ethnic-specific population breast cancer incidence rates from the National Cancer Institute (NCI)'s Surveillance, Epidemiology, and End Results (SEER) program. BCRAT uses SEER incidence rates for non-Hispanic whites from 1983 to 1987, for non-Hispanic Blacks from 1994 to 1998, for Hispanics from 1990 to 1996, and for Asians from 1998 to 2002. The model then adjusts a woman's risk by considering whether risk factors included in the model are present or absent and the relative risk estimate of each risk factor. The model also considers the amount of risk that can be explained by the risk factors included (attributable risk). Finally, BCRAT considers a woman's age based risk of death using National Center for Health Statistics data (7). All women in an age group are considered to have the same risk of death regardless of their health. The source data (Supplementary Table 1, available online) and formula for BCRAT may be found in the Supplementary Materials (available online).

Data

We describe briefly below each cohort used in our analyses (12–14); detailed descriptions are in the Supplementary Materials (available online). NHS is a longitudinal study of 121 700 female nurses, age 30 to 55 years in 1976, from 11 of the most populous US states (14). At baseline and in biennial follow-ups, participants provide detailed lifestyle and medical history information through mailed questionnaires. WHI is a multicenter study that recruited 161 808 postmenopausal US women age 50 to 79 years in up to three clinical trials (WHI-CTs) or an observational study (WHI-OS) from 1993 to 1998 and initially followed women through March 2005. The majority of participants (82% of WHI-CT participants and 73% of WHI-OS participants) agreed to an extension study (WHI-ES; n = 115 400) through September 2010. We chose WHI-ES participants for our analyses because many had aged past 75 years and most had stopped using hormone therapy, which is typical of current practice (15).

Sample

NHS

Participants entered our study the month they returned their 2004 questionnaire (NHS measures dates in months). Questionnaires could be returned through May 2006 (4.5% of participants returned their 2004 questionnaire in 2006), so entry into the study varied. We excluded women who were alive in 2004 but did not complete a 2004 questionnaire (n = 12 539) because ascertainment of breast cancer may be incomplete for these women. We chose to begin following NHS participants in 2004 because this time period is similar to that of WHI-ES and is two years after publication of WHI's estrogen plus progesterone (E+P) clinical trial results that found that use of E+P increased breast cancer risk (16). Breast cancer risk associated with E+P was found to rapidly decline within two years of discontinuation (15). Participants ranged in age from 57 to 86 years at study entry.

WHI-ES

Participants entered our study the day they consented to participate in WHI-ES. Participants were between age 55 and 91 years at study entry. In primary analyses, we excluded women with a history of cancer (except nonmelanomatous skin cancer) in both cohorts (n = 9394 in NHS, n = 9812 in WHI) because NHS does not confirm second diagnoses of cancer.

Outcomes

We followed participants for up to five years or until they developed invasive breast cancer or died, whichever came first. All WHI breast cancer cases were confirmed by pathology report. For NHS, we also included self-reported breast cancers (12% of cases) because validation studies have found that self-reported breast cancers in NHS are accurate (99% are confirmed when medical records are obtained) (17). Detailed definitions of covariates and outcome variables are in the Supplementary Materials (available online).

Risk Factors

We used available data on BCRAT risk factors (age, race/ethnicity, age at menarche, age at first birth, family history, and history of benign breast biopsy). Because NHS does not provide information on Asian ethnicity subgroups, to determine baseline breast cancer incidence for Asians we randomly assigned Asian ethnicity for the 0.83% of NHS participants that were Asian using 1970 Census data (NHS began in 1976). While BCRAT follows women through 89.999 years, it does not compute five-year probabilities for women older than age 85 years at entry. Therefore, we reclassified women older than age 85 years at study entry as being 85 (17 NHS and 1253 WHI-ES participants were reclassified). To further compare NHS and WHI-ES participants, we used data on participant mammography use in the past two years, body mass index, oophorectomies, hormone therapy use, and history of significant illness (including diabetes, myocardial infarction, emphysema, congestive heart failure, stroke, or peripheral artery disease). In NHS, all of these conditions were confirmed through follow-up of participants and/or review of their medical records except for emphysema and heart failure. In WHI-ES, all conditions were physician-adjudicated with medical records except for emphysema and diabetes. WHI-ES does not assess reasons for undergoing mammography; therefore, we present receipt of any mammogram in the past two years.

Statistical Analyses

We used chi-square tests to compare characteristics between NHS and WHI-ES. Tests of statistical significance were two-sided, and a P value of less than .05 was considered to be statistically significant. To examine BCRAT's performance, we measured BCRAT's calibration and discrimination within our cohorts stratified by age (55-74 vs 75+) (18). Calibration assesses whether a model's predicted probabilities are accurate. Discrimination assesses how well a model distinguishes between individuals who do or do not experience the event of interest. A model that discriminates well will assign higher risk values to those who develop the outcome of interest (18). To assess calibration, we compared the expected (E) number of breast cancers based on BCRAT estimates (calculated using BCRAT's SAS macro) (7) to the observed number (O) in each cohort overall and within deciles of risk stratified by age (55-74, 75+ years). To determine deciles of risk, we ordered the probabilities given by BCRAT for each age group within a cohort and categorized these probabilities into deciles. Within each decile, we took the average probability of risk and multiplied this probability by the sample size within each decile to determine the expected number of breast cancers (E). We calculated 95% confidence intervals (CIs) of E/O ratios using the Poisson variance for the logarithm of the observed number of cases (19). We further assessed calibration using the Hosmer-Lemeshow (HL) chi-square test. An E/O ratio close to 1 (meaning the model's estimates of risk matches the actual risk) and a nonsignificant HL-test statistic indicate good calibration (20). To assess BCRAT's discrimination, we used Rosner and Glynn's methods to determine the c-statistic or area under the receiver operating characteristic curve and its standard error (21). This area ranges from 0.5 (no discrimination) to 1.0

Sensitivity Analyses

Because previous studies found that BCRAT performs better among women who undergo mammography, we repeated our analyses limiting our sample to women who underwent mammography in the past two years (10,22,23). Because we were interested in BCRAT's performance among women age 75 years and older and comorbidity increases with age, we repeated our analyses excluding women with significant illnesses (defined above). In addition, we repeated our analyses limiting our sample to women who were recently screened and were without significant illness. We also repeated our analyses using SEER incidence rates from 2006 to 2010 for whites, blacks, and Hispanics because these data matched our study period. Because previous studies found that BCRAT performs better when predicting estrogen receptor-positive (ER+) breast cancer; we reassessed BCRAT's discrimination using ER+ breast cancer as our outcome (24). We also repeated our analyses including all participants regardless of missing data.

In addition, we examined BCRAT's performance among women who originally participated in WHI-OS and WHI-CT separately. Although BCRAT considers history of atypical hyperplasia, information on atypia was only available for 1155 NHS participants. However, atypia was captured for 38 218 WHI-CT participants during the trial and we repeated our analyses among these women adding history of atypia (25). In addition, we repeated our analyses including women in WHI-ES with a history of cancer (excluding breast cancer).

To examine if qualitative differences in E/O ratios and c-statistics resulting from our sensitivity analyses were statistically significant, we used bootstrapping to estimate the standard error of the difference and the z-statistics from which we computed the P values.

Relative Risks

We present the relative risks associated with each BCRAT risk factor from NHS and WHI-ES calculated using multivariable logistic regression. All analyses were completed using SAS statistical software, version 9.3 (SAS Institute Inc., NC).



Table 1. Baseline characteristics, overall and by age, among Nurses' Health Study (n = 73 072) and the Women's Health Initiative ExtensionStudy (n = 97 081) participants* \dagger

		NHS*			WHI-ES*	
Breast cancer risk assessment tool risk factors	Overall (n = 73 072)	57–74‡ y (n = 53 356)	75+ y (n = 19 716)	Overall (n = 97 081)	55–64 y (n = 68 741)	75+ y (n = 28 340)
Age, mean (SD), y	70 (7)	66 (4.8)	79 (2.4)	71 (6.8)	67 (4.5)	79 (3.1)
Race						
Non-Hispanic white, %	96.2	96.1	96.3	84.7	83.0	88.8
Non-Hispanic black, %	1.8	1.8	1.7	7.4	8.3	5.1
Hispanic, %	0.9	0.9	0.9	3.8	4.5	2.4
Asian, %	0.9	0.8	0.9	2.1	2.2	1.9
Hawaiian/Pacific Islander, %	0.0	0.0	0.0	0.2	0.2	0.1
Native American, %	0.2	0.2	0.2	1.0	1.1	0.7
Unknown, %	0.0	0.0	0.0	0.8	0.7	1.0
Age at menarche, y						
≤11, %	22.2	23.3	19.4	22.1	23.7	18.2
12–13, %	57.4	57.7	56.4	55.2	54.9	55.9
≥14, %	19.7	18.3	23.3	22.4	21.1	25.5
Unknown	0.7	0.7	0.9	0.3	0.3	0.4
Age at first birth, y						
≤19, %	0.7	0.8	0.5	12.2	14.2	7.4
20–24, %	48.9	53.2	37.4	38.9	40.4	35.4
25–29, %	35.0	32.8	40.9	21.9	20.0	26.4
≥30, %	8.5	6.7	13.4	7.3	6.3	9.7
Nulliparous	5.1	4.9	5.9	2.5	2.7	1.9
Unknown	1.7	1.7	1.8	17.2	16.4	19.3
Number of biopsies						
0, %	73.6	72.6	76.2	71.9	71.9	72.0
1, %	23.2	23.8	21.5	17.5	17.5	17.4
2+, %	3.2	3.6	2.4	10.6	10.6	10.6
First-degree relatives with history of breast	cancer					
0, %	82.3	83.3	79.6	86.7	87.3	85.1
1, %	15.6	15.1	17.2	12.1	11.7	13.3
2+, %	2.1	1.7	3.1	1.2	1.0	1.6
Other covariates of interest						
Mammogram in past 2 y						
Yes, %	73.2	75.2	67.8	84.6	86.3	80.4
No, %	9.5	7.8	13.9	15.2	13.5	19.4
Unknown, %	17.4	17.0	18.4	0.2	0.2	0.2
Mammogram in past 2 y excluding unknowns, %	88.5	90.6	83.0	84.7	86.4	80.6
Postmenopausal hormone therapy use						
Never, %	30.6	28.2	37.3	40.8	36.2	51.8
Past-estrogen alone	18.9	16.6	25.0	36.9	39.0	31.9
Past-estrogen plus progesterone	29.4	33.6	18.0	16.4	18.5	11.4
Past user, unknown type	4.2	2.5	9.0	0.0	0.0	0.0
Current estrogen alone user	11.3	12.3	8.5	5.5	5.8	4.8
Current estrogen plus progesterone user	5.0	6.2	1.8	0.4	0.5	0.2
Current user, unknown type	0.6	0.6	0.5	0.0	0.0	0.0
Body mass index, kg/m ² § <20, %	6.41	4.94	10.38	3.3	3.0	3.9
20–24, %	37.13	35.34	41.98	30.6	29.6	32.9
25–29, %	33.66	34.14	32.35	34.9	33.9	37.2
30+, %	22.66	25.45	15.10	30.4	32.6	25.0
Unknown	7.8	7.7	7.8	0.9	0.9	1.0
Oophorectomy, %						
At least 1 ovary intact	72.93	74.29	69.26	80.9	81.3	80.0
Bilateral oophorectomy	25.15	24.05	28.13	18.3	18.1	18.8
At least 1 ovary removed	1.92	1.66	2.61	0.8	0.6	1.2
Significant illnesses						
Diabetes, %	11.1	10.4	13.0	9.9	9.7	10.3
Emphysema, %	7.7	6.5	10.9	5.8	5.2	7.2
Myocardial infarction, %	2.6	1.8	4.5	3.4	2.4	5.9
Peripheral artery disease, %	0.8	0.6	1.3	1.8	1.4	2.7

Table 1. Continued

		NHS*		WHI-ES*			
Breast cancer risk assessment tool risk factors	Overall (n = 73 072)	57–74‡ y (n = 53 356)	75+ y (n = 19 716)	Overall (n = 97 081)	55–64 y (n = 68 741)	75+ y (n = 28 340)	
Stroke, %	2.2	1.5	4.2	2.2	1.6	3.7	
Congestive heart failure, %	3.1	1.9	6.4	2.2	1.4	4.0	
Number of significant illnesses from above							
0, %	77.9	81.0	69.2	79.5	81.9	73.7	
1, %	17.9	15.9	23.2	16.7	15.2	20.5	
2+, %	4.3	3.1	7.5	3.8	2.9	5.9	
Outcomes							
Breast cancer diagnosed during study, %	1.8	1.8	1.8	2.0	2.0	1.9	
Died during study, %	6.8	3.6	15.3	5.4	3.1	11.0	

* Nurses' Health Study included participants that completed the 2004 questionnaire. Women's Health Initiative Extension Study began in 2005. NHS = Nurses' Health Study; WHI-ES = Women's Health Initiative Extension Study.

+ All comparisons between NHS and WHI-ES overall were statistically significant at P < .001 using chi-square statistics, except the P value for the difference between breast cancer incidence was P = .02.

‡ The youngest women in NHS at study entry were age 57 years.

§ Body mass index was based on nurse self-report in NHS and was measured in WHI.

|| In NHS, diabetes, myocardial infarction, peripheral artery disease, and stroke were confirmed by participants and/or adjudicated by review of their medical records. Congestive heart failure, myocardial infarction, peripheral artery disease, and stroke were physician adjudicated with medical records in WHI-ES. Participants were followed for five years.

Results

Sample

We included 73 072 NHS (27.0% ≥75 years) and 97 081 WHI-ES participants (29.2% \geq 75 years). Because of the large sample sizes, even small differences between NHS and WHI-ES were statistically significant (Table 1). Fewer NHS participants (1.7%) were missing data on age at first birth than WHI-ES participants (17.2%, P < .001). More NHS participants (17.4%) were missing data on recent mammography use than WHI-ES participants (0.2%, P < .001); these NHS participants completed a shorter version of the 2004 questionnaire that did not assess mammography use. Otherwise, there were small differences in missing data between cohorts on sample characteristics. WHI-ES participants were more racially/ethnically diverse (96.2% vs 84.7%, P < .001), younger at first birth, more likely to have had a breast biopsy, and to have a BMI of 30 kg/m² or more; they were less likely to have a family history of breast cancer and to have ever used hormone replacement therapy. NHS participants were more likely to have significant illness (22.1% vs 20.5%, P < .001) and to die during follow-up (6.8% vs 5.4%, P < .001; 15.3% vs 11.0% among women ≥75 years). Fewer NHS participants were diagnosed with breast cancer than WHI-ES participants (1.8% vs 2.0%, P = .02).

Calibration

Calibration graphs (Figure 2) demonstrate that BCRAT accurately predicted breast cancer risk in WHI-ES except for participants categorized as being at the highest risk, where BCRAT overpredicted breast cancer risk. Supplementary Table 2 (available online) presents E/O ratios and their 95% confidence intervals for each decile of risk stratified by age and cohort. BCRAT was more likely to overpredict breast cancer risk in NHS, particularly for women categorized as being at higher risk and among women age 75 years and older (Table 2). E/O ratios on average by age in WHI-ES were 1.03 (95% CI = 0.97 to 1.09) for women age 75 years and older (P = .21). In NHS, E/O ratios on average by age were 1.16 (95% CI = 1.09 to 1.23) for women age 57 to 74 years

and 1.31 (95% CI = 1.18 to 1.45) for women age 75 years and older (P = .02 for age comparison). Hosmer-Lemeshow tests were statistically significantly different from 1 among NHS participants and among WHI-ES participants age 55 to 74 years. The P value for the Hosmer-Lemeshow test among women age 75 years and older in WHI-ES was .05.

In both cohorts, the 95% confidence intervals of the E/O ratios crossed one for women age 75 years and older when we limited our sample to women who underwent mammography and were without significant illness (E/O ratios decreased from 1.30, 95% CI = 1.17 to 1.45, to 1.13, 95% CI = 0.98 to 1.29, P = .12 in NHS and from 1.10, 95% CI = 1.00 to 1.21, to 1.04, 95% CI = 0.92 to 1.16 in WHI-ES, P = .42). Modifying our samples did not improve E/O ratios for women age 55 to 74 years. Using 2006 to 2010 SEER incidence rates led to statistically significantly increased E/O ratios among women age 55 to 74 years in both cohorts but did not statistically change E/O ratios among women age 75 years and older.

Within WHI-ES, BCRAT's calibration was similar between WHI-OS and WHI-CT participants (Supplementary Table 4, available online). Among WHI-CT participants, including information on history of atypia did not change BCRAT's calibration (Supplementary Table 4, available online). Including women with a history of cancer also did not change calibration in WHI-ES (Supplementary Table 8, available online).

Discrimination

BCRAT c-statistics ranged between 0.56 and 0.58 in both cohorts regardless of age and regardless of which SEER breast cancer incidence rates were used. None of the sensitivity analyses led to statistically significant improvements in c-statistics. However, c-statistics tended to improve among women age 75 years and older when the outcome was limited to ER+ breast cancer (eg, in NHS, c-statistic improved from 0.57 to 0.60, P = .21).

Relative Risks

RRs for the interaction between family history and age at first birth tended to be higher in the BCRAT development cohort

Table 2. Breast Cancer Risk AssessmentInitiative Extension Study (n = 79 611) ps	t Tool's calibration (e: articipants	xpected/observed br	east cancer cases an	ıd 95% confidence i	intervals) among Nu	rses' Health Study (r	n = 71 293) and the V	Vomen's Health
		SHN				WHI-ES		
Calibration	Overall $(n = 71293)$	57–74 y† (n = 52 111)	75+ y (n = 19 182)	P age comparison	Overall $(n = 79 611)$	Age 55–74 y (n = 57 009)	Age 75+ y (n = 22 602)	P age comparison
Primary analyses (expected/observed ratios)‡,§	C C 7	U 7 7	7 0 7	5	C C	3	ç	ć
bukat expected observed ratios (95% CI) Hosmer-Lemeshow P	1.13 to 1.26) <.0001	1.10 (1.09 to 1.23) <.0001	1.0.1 (1.18 to 1.45) <.0001	20.	c0.1 (1.00 to 1.10) <.0001	0.97 to 1.09 (0.97 to 1.09) <.0001	т.10 (1.00 to 1.21) .051	17:
Sensitivity analyses	7	711		20	-	- CO -	1 10	07
underwent mammography in past 2 y (NHS = 52 380,	(1.11 to 1.25)	(1.09 to 1.25)	1.07 to 1.36)	0	1.0 1 (0.98 to 1.10)	(0.96 to 1.10)	0.97 to 1.18)	CT.
verus = 10, 400) Limited to women without	1.19	1.17	1.24	36	1.05	1.04	1.07	.60
significant illness§ (NHS = 55 567 WHI = 63 439)	(1.12 to 1.26)	(1.09 to 1.26)	(1.09 to 1.40)	2	(0.99 to 1.11)	(0.97 to 1.11)	(0.96 to 1.19)	
Limited to women who	1.17	1.19	1.13	.47	1.03	1.03	1.04	.97
underwent mammography in past 2 y and without significant illness, (NHS = 41 887, WHI = 54 255)	(1.09 to 1.26)	(1.10 to 1.29)	(0.98 to 1.30)		(0.97 to 1.10)	(0.96 to 1.11)	(0.92 to 1.16)	
Sensitivity analyses (changing SEER inci Using SEER incidence	idence) 1.27	1.25¶	1.33	.21	1.12	1.12¶	1.12	26.
rates from 2006-2010 (NHS = 71 293, WHI = 79 611)	(1.20 to 1.34)	(1.17 to 1.33)	(1.20 to 1.48)		(1.07 to 1.18)	(1.06 to 1.19)	(1.02 to 1.23)	
* Nurses' Health Study included participants al ogy, and End Results; WHI-ES = Women's Healt † The youngest women in NHS in 2004 were ag ±We compared the expected number of breast	live in 2004. Women's He th Initiative Extension St ge 57 years. t cancers based on Breas	alth Initiative Extension tudy. tt Cancer Risk Assessme	ı Study began in 2005. C nt Tool (BCRAT) estimat	 Confidence interve Confidence interve Calculated using th 	il; E/O; expected/observ ne BCRAT SAS macrol tc	ed; NHS = Nurses' Healt o the observed number i	h Study; SEER = Surveill in each cohort stratified	ance, Epidemiol- bv age (55–74,
75+ years) (7). To determine the 95% CI of the E, approximation z-test.	c/O ratios, we used the Po	oisson variance of the lo	garithm of the observe	d number of cases (19)). To test whether E/O ra	tio estimates differed by	y age within cohort, we	used the normal
§ Significant illnesses included: history of diab- For our primary analyses, we used SEER breas	betes, myocardial infarcti st cancer incidence rate:	ion, congestive heart fai s from 1983–1987 for wh	lure, stroke, emphysem ites, from 1994–1998 fo:	a, and peripheral arte. r blacks, from 1990–19	ry disease. 96 for Hispanics, and fro	om 1988–2002 for Asians	s. In sensitivity analyses	s, we used SEER
incidence rates from 2006–2010 for whites, blac 1 This represents a statistically significant char	cks, and Hispanics. nge (P < .05) from the rec	sults of the primary ana	lyses. To examine if qua	alitative differences in	E/O ratios resulting fro	m our sensitivity analys	ses were statistically diff	ferent than in
primary analyses, we used bootstrapping to est	stimate the standard erro	or of the difference and	the z-statistics from wh	nich we computed the	P values.			

M. A. Schonberg et al. | 6 of 11



Figure 2. Calibration by decile of risk and by age among participants in the Nurses' Health Study (n = 73 072) and the Women's Health Initiative Extension Study (n = 97 081).

(Breast Cancer Demonstration and Detection Project, BCDDP) (10) than in NHS or WHI-ES (Table 4). Age at menarche was not a statistically significant breast cancer risk factor for WHI-ES or for NHS participants age 75 years and older.

Discussion

In WHI-ES, BCRAT accurately predicted five-year breast cancer risk for women age 55 to 74 years and overpredicted breast cancer risk by 10% on average among participants age 75 years and older. In NHS, BCRAT overpredicted breast cancer risk by 16% on average among women age 57 to 74 years and by 31% on average among women age 75 years and older. In both cohorts, BCRAT was most likely to overpredict breast cancer among women categorized as being at higher risk. BCRAT's prediction accuracy improved among women age 75 years and older when the samples were limited to women who underwent mammography and were without significant illness, suggesting that BCRAT may be most appropriate to use among older women with these characteristics. BCRAT's discrimination was modest in both cohorts and age groups, with c-statistics ranging between 0.56 and 0.58.

BCRAT's performance has previously been tested among NHS participants using data from: 1) 1976 (26), 2) 1982 (26), and 3) 1992 (27) (when participants were age 30–55, 36–61, and 45–71 years, respectively). In the first two analyses, the model was used to predict invasive and noninvasive breast cancer and baseline breast cancer incidence was estimated using BCDDP data. In the third analysis, BCRAT was used to predict only invasive breast cancer and 1987 SEER incidence rates were used to estimate baseline breast cancer incidence. In the first two

analyses, BCRAT was found to overestimate breast cancer risk by 33%, which was attributed to greater use of mammography by BCDDP participants than NHS participants. Because mammography may find breast cancer before symptoms develop and may even find some cancers that would never have caused problems, mammography may lead to an increased estimated risk among those who are screened (28,29). In the third analysis, BCRAT was found to underestimate breast cancer by 6%, which was attributed to greater use of mammography by NHS participants than among SEER participants. Similar to our findings, BRCAT's c-statistic in the third analysis was 0.58 (95% CI = 0.56 to 0.60) (27).

In addition, BCRAT's performance was tested among WHI participants beginning at enrollment (between 1993–1998) (24). In that study, BCRAT was found to underestimate breast cancer by 20%, which was attributed to greater use of mammography and breast biopsies among WHI participants than in SEER. That study also found that BCRAT's c-statistic was 0.58 and improved to 0.60 when the outcome was limited to ER+ breast cancer. This finding was attributed to the fact that older women are more likely to develop ER+ breast cancer (30) and may explain why we also found that BCRAT tended to show better discrimination among women age 75 years and older when predicting ER+ breast cancer. BCRAT's performance has also been tested in other cohorts of older women. In the National Institutes of Health-AARP Diet and Health Study (recruited women age 50-71 years between 1995-1996) and the Prostate, Lung, Colorectal, and Ovarian Cancer Screening trial (recruited women age 55-74 years between 1993-2001), BCRAT underpredicted breast cancer by 13% to 14%, which was attributed to use of

		NHS*				WHI-ES*		
Discrimination	Overall (n = 71 293)	$57-74 \text{ y}^{\dagger}$ (n = 52 111)	75+ y (n = 19 182)	P‡ age comparison	Overall (n = 79 611)	55-74 y (n = 57 009)	75+ y (n = 22 602)	P‡ age comparison
Primary analyses‡,§ BCRAT c-statistic (95% CI)	0.565	0.564	0.569	.78	0.578	0.577	0.579	
	(0.549 to 0.580)	(0.546 to 0.582)	(0.538 to 0.600)		(0.563 to 0.592)	(0.560 to 0.594)	(0.552 to 0.606)	
Sensitivity analyses								
Limited to women who underwent	0.567	0.567	0.564	.86	0.582	0.581	0.585	.82
mammography in past 2 y	(0.549 to 0.585)	(0.547 to 0.588)	(0.529 to 0.599)		(0.567 to 0.597)	(0.563 to 0.599)	(0.556 to 0.614)	
(NHS = 52 380, WHI = 67 457)								
Limited to women without significant	0.563	0.563	0.563	1.00	0.571	0.573	0.563	.60
illness (NHS = 55 567, WHI = 63 437)	(0.545 to 0.581)	(0.543 to 0.584)	(0.527 to 0.599)		(0.555 to 0.587)	(0.554 to 0.592)	(0.532 to 0.595)	
Limiting outcome to estrogen	0.568	0.562	0.598	60.	0.578	0.576	0.586^{2}	.56
receptor-positive breast cancers	(0.550 to 0.587)	(0.541 to 0.583)	(0.562 to 0.635)		(0.563 to 0.594)	(0.557 to 0.594)	(0.556 to 0.616)	
(NHS = 70 295, WHI = 79 343)								
Sensitivity analyses (changing SEER inci	idence)§							
Using SEER incidence	0.567	0.566	0.569	06.	0.575	0.575	0.576	66.
rates from 2006–2010	(0.551 to 0.583)	(0.548 to 0.585)	(0.538 to 0.599)		(0.561 to 0.590)	(0.559 to 0.592)	(0.549 to 0.603)	
(NHS = 71 293, WHI = 79 611)								

Table 3. Breast Cancer Risk Assessment Tool's discrimination (c-statistics and 95% confidence intervals) among Nurses' Health Study (n = 71 293) and the Women's Health Initiative Extension study (n = 79.611) participants

* Nurses' Health Study included participants alive in 2004. Women's Health Initiative Extension Study began in 2005. CI = confidence interval; NHS = Nurses' Health Study; SEER = Surveillance, Epidemiology, and End Results; WHI-ES = Women's Health Initiative Extension Study.

† The youngest women in NHS in 2004 were age 57 years.
‡ To assess discrimination in each cohort, we calculated the c-statistic or area under the receiver operating characteristic (ROC) curve and its standard error (21). To test if c-statistics differed by age within cohort, we used the normal approximation z-test.

§ For our primary analyses, we used SEER breast cancer incidence rates from 1983–1987 for whites, from 1994–1998 for blacks, from 1990–1996 for Hispanics, and from 1988–2002 for Asians. In sensitivity analyses, we used SEER incidence rates from 2006–2010 for whites, blacks, and Hispanics.

|| Significant illnesses included: history of diabetes, myocardial infarction, congestive heart failure, stroke, emphysema, and peripheral artery disease.

	BCDDP*	NHS*,†	WHI-ES*,†	NHS*,†	WHI-ES*,†	NHS*,†	WHI-ES*,†
	Overall	Overall	Overall	55–74 y‡	55–74 y	75+ y	75+ y
Risk factors		(n = 71 293)	(n = 79 611)	(n = 52 111)	(n = 57 009)	(n = 19 182)	(n = 22 602)
Age at menarche, y							
≤11, %	1.21	1.27 (1.07 to 1.50)	1.08 (0.93 to 1.25)	1.38 (1.14 to 1.68)	1.02 (0.86 to 1.21)	0.99 (0.72 to 1.37)	1.22 (0.92 to 1.62)
12–13, %	1.10	1.13 (1.04 to 1.22)	1.04 (0.96 to 1.12)	1.17 (1.07 to 1.30)	1.01 (0.93 to 1.10)	0.99 (0.85 to 1.17)	1.10 (0.96 to 1.27)
≥14, %	1.0	1.0	1.0	1.0	1.0	1.0	1.0
Age at first birth, y X	0,1,2+ first o	legree relatives					
≤19 and 0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
≤19 and 1	2.61	1.46 (1.12 to 1.91)	1.48 (1.21 to 1.81)	1.33 (0.96 to 1.84)	1.47 (1.15 to 1.86)	1.87 (1.16 to 3.00)	1.50 (1.01 to 2.22)
≤19 and 2+	6.80	2.13 (1.25 to 3.64)	2.18 (1.45 to 3.29)	1.77 (0.92 to 3.40)	2.15 (1.33 to 3.48)	3.50 (1.35, 9.02)	2.24 (1.02 to 4.91)
20–24 and 0	1.24	1.11 (1.01 to 1.22)	1.13 (1.06 to 1.21)	1.13 (1.02 to 1.26)	1.14 (1.06 to 1.23)	1.09 (0.91 to 1.30)	1.12 (0.98 to 1.27)
20–24 and 1	2.68	1.58 (1.30 to 1.90)	1.67 (1.44 to 1.92)	1.51 (1.21 to 1.89)	1.71 (1.44 to 2.01)	1.82 (1.26 to 2.62)	1.61 (1.22 to 2.14)
20–24 and 2+	5.78	2.24 (1.63 to 3.07)	2.45 (1.91 to 3.16)	2.01 (1.38 to 2.94)	2.54 (1.89 to 3.42)	3.05 (1.67 to 5.56)	2.33 (1.42 to 3.80)
25–29/nulliparous§ and 0	1.55	(1.03 to 1.48)	1.28 (1.13 to 1.46)	1.28 (1.03 to 1.59)	1.31 (1.12 to 1.52)	1.18 (0.83 to 1.69)	1.25 (0.97 to 1.60)
25–29/nulliparous and 1	2.76	1.70 (1.40 to 2.06)	1.88 (1.61 to 2.20)	1.71 (1.36 to 2.16)	1.98 (1.64 to 2.40)	1.77 (1.22 to 2.58)	1.74 (1.29 to 2.33)
25–29/nulliparous and 2+	4.91	2.34 (1.80 to 3.05)	2.75 (2.13 to 3.56)	2.29 (1.65 to 3.18)	3.00 (2.19 to 4.12)	2.65 (1 65 to 4 27)	2.41 (1.54 to 3.78)
≥30 and 0	1.93	1.37 (1.04 to 1.80)	1.46 (1.20 to 1.77)	1.46 (1.05 to 2.01)	1.49 (1.19 to 1.88)	1.29 (0.75 to 2.20)	(1.40 (0.96 to 2.04)
≥30 and 1	2.83	1.83 (1.39 to 2.41)	2.12 (1.68 to 2.68)	1.95 (1.38 to 2.75)	2.30 (1.72 to 3.07)	1.72 (1.04 to 2.85)	1.87 (1.23 to 2.85)
≥30 and 2+	4.17	2.46 (1.59 to 3.79)	3.09 (2.04 to 4.68)	2.60 (1.47 to 4.60)	3.55 (2.11 to 5.96)	2.31 (1.14 to 4.67)	2.51 (1.23 to 5.09)
No. of biopsies		(((,
0	1.0	1.0	1.0	1.0	1.0	1.0	1.0
1	1.27	1.32 (1.21 to 1.45)	1.27 (1.19 to 1.36)	1.33 (1.20 to 1.48)	1.25 (1.15 to 1.35)	1.29 (1.07 to 1.57)	1.33 (1.18 to 1.50)
2+	1.62	(1.45 to 2.10) (1.45 to 2.10)	(1.13 to 1.80) 1.61 (1.41 to 1.84)	(1.23 to 1.18) 1.77 (1.43 to 2.18)	(1.33 to 1.82) (1.33 to 1.82)	1.67 (1.13 to 2.46)	1.77 (1.38 to 2.26)

Table 4.	Relative risks and 95%	confidence intervals for I	Breast Cancer Risk Ass	sessment Tool risk factors	from BCDDP, NHS,	and WHI-ES
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* Nurses' Health Study began in 2004. Women's Health Initiative Extension Study began in 2005. BCDDP = Breast Cancer Demonstration and Detection Project (31); CI = confidence interval; NHS = Nurses' Health Study; RR = relative risk; WHI-ES = Women's Health Initiative Extension Study.

+ The relative risks for Gail model risk factors were estimated from logistic regression models. The Gail model treated each variable (as it is categorized) as continuous in its model.

‡ The youngest women in NHS in 2004 were age 57 years.

§ No separate indicator was used for nulliparous women.

SEER incidence rates from 1983 to 1987 (21). BCRAT's calibration improved when 1995 to 2003 SEER incidence rates were used, which corresponded to the time period of that study. BCRAT's c-statistic in these cohorts was 0.58 to 0.59 (22,24). These studies and our data suggest that BCRAT has modest discrimination in predicting breast cancer among postmenopausal women.

Interestingly, we found BCRAT's calibration to be better in WHI-ES than NHS. This is likely because breast cancer incidence in WHI-ES (2.0%) was more similar to SEER (Supplementary Table 5, available online). Breast cancer incidence may have been lower in NHS (1.8%) because NHS participants were less likely to undergo breast biopsy, were less likely to be obese, and were more likely to undergo oophorectomy. Also, NHS participants, particularly those age 75 years and older, were more likely to have significant illness and to die. Competing mortality risks may have prevented these women from undergoing mammography and as a result these women would have been less likely to have an early-stage breast cancer detected (Supplementary Table 6, available online). Also, 1069 NHS participants (1.5% of our sample) remained alive during our study but did not complete a follow-up questionnaire. Breast cancer may have been missed among these women. If we assume that 2.0% of these women were diagnosed with breast cancer, then our overall incidence in NHS would increase to 1.9%. Only 111 of the WHI participants that remained alive during our study period did not complete a follow-up questionnaire.

While we found that BCRAT provides accurate probabilities of five-year breast cancer risk for older women without significant illness who undergo mammography, it has modest discrimination. Including additional breast cancer risk factors in BCRAT such as breast density has been shown to improve discrimination modestly (31); unfortunately, our data do not include adequate information on participant breast density. Considering risk factors that are important in predicting latelife breast cancer (eg, obesity) may also be needed to improve BCRAT's discrimination among older women. Also, the RRs associated with some of the risk factors in BCRAT, such as family history, may no long be accurate. Broad use of mammography has led to increased detection of early-stage breast cancers and may have attenuated the impact of a family history of breast cancer on late-life breast cancer risk.

Our study has limitations. Family history of breast cancer and diagnosis of emphysema (for WHI-CT participants only) were obtained on average 8.5 years before start of the WHI-ES and therefore may be underestimated in WHI-ES. Although 17% of WHI-ES participants were missing data on age at first birth, when we repeated our analyses including these women our results did not change (Supplementary Table 8, available online).

In summary, BCRAT provides accurate five-year probabilities of breast cancer among women age 75 years and older who undergo mammography and are without significant illness but tends to overpredict breast cancer among postmenopausal women categorized at the highest risk of breast cancer. Discrimination of the model is modest among all postmenopausal women. Incorporating other aspects of personalized breast cancer risk including lifelong estrogen exposure (eg, from obesity) and competing mortality risks may improve model performance.

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