

Personalizing Breast Cancer Screening Based on Polygenic Risk and Family History

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Abstract

Background:

We assessed the clinical utility of a first-degree breast cancer family history (FH) and polygenic risk score (PRS) to inform screening decisions among women aged 30-50 years.

Method:

Two established breast cancer models evaluated digital mammography screening strategies in the 1985 US birth cohort by risk groups defined by family history and polygenic risk score (PRS) based on 313-single nucleotide polymorphism. Strategies varied in initiation age (30, 35, 40, 45, 50) and interval (annual, hybrid, biennial [B], triennial). The benefits, breast cancer deaths averted, life years gained (LYG) and harms, false-positive (FP) mammograms, overdiagnoses, were compared those seen with three established screening guidelines.

Results:

Women with a breast cancer FH who initiate biennial screening at age 40 years (vs. 50) had a 36% (model range: 29%-40%) increase in LYG and 20% (model range: 16%-24%) more breast cancer deaths averted, but 21% (model range: 17%-23%) more overdiagnoses and 63% (model range: 62%-64%) more false positives. Screening tailored to PRS vs. biennial 50-74 screening had smaller positive effects on LYG (20%) and breast cancer deaths averted (11%) but also smaller increases in overdiagnoses (10%) and false positives (26%). Combined use of FH and PRS vs. B50-74 had the greatest increase in LYG (29%) and breast cancer deaths averted (18%).

Conclusion:

Our results suggest that breast cancer family history and polygenic risk could guide screening decisions before age 50 years among women at increased risk for breast cancer, but should consider expected increases in overdiagnoses and false positives.

Routine mammography screening starting at age 45 or 50 years has been shown to reduce population breast cancer mortality for women at average risk.(1) It remains uncertain whether current screening guidelines (2-4) are optimal for individual women, given the variability in breast cancer risk at any given age. The American Cancer Society (ACS) and the United States Preventive Services Task Force (USPSTF) recommend that women before the age of 45 or 50 years discuss their individual risk and screening options with their healthcare providers, yet there are limited data to inform such discussions. Risk-based screening has been proposed as a way to inform decisions about the starting age- and frequency of screening for women at different levels of risk. Recent discoveries in the field of breast cancer genetics may hold the potential to guide risk-based screening strategies. The risk of developing breast cancer approximately doubles for women with a first-degree family member with breast cancer.(5) Approximately 20% of the familial risk is attributable to high- or moderate penetrance mutations in genes including BRCA1, BRCA2, PALB2, ATM, and CHEK2.(6, 7) The remaining 80% is due to a combination of more common variations in the DNA sequence (single nucleotide polymorphisms [SNPs]). Currently, about 313 common SNPs have been identified as associated with breast cancer risk.(8) While these individual variants are associated with small to modest increased risk, their combined effects considered as a polygenic risk score (PRS) could be useful in targeting screening strategies based on risk.(9, 10)

Two ongoing trials, My Personal Breast Screening (My-PEBS) and the Women Informed to Screen Depending on Measures of Risk (WISDOM) trial are presently testing age-based vs. risk-based screening approaches that include genetic markers and family history information, but results are not expected until 2024-2025.(11) A recent study in the UK modeled the use of PRS to determine the cost-effectiveness of screening women triennially above a certain risk threshold.(12) However, there are no studies that have compared the impact of screening strategies tailored to risk based on family history of breast cancer and polygenic risk combined.

To fill this clinical gap, two established Cancer Intervention and Surveillance Modeling Network (CISNET) models that were used to inform the current USPSTF breast cancer screening guidelines(13), estimated the lifetime effects of screening based on family history status and polygenic risk.(2) The results are intended to support conversations between women and their healthcare providers about the benefits and harms of starting screening before age 50 years. The findings could also provide data to inform policy discussions about risk-tailored screening guidelines.

METHODS

This modeling research used de-identified, publicly available data and was considered human subjects exempt by the Georgetown University Institutional Review Board, the IRB of record.

Model overview

Breast cancer simulation models developed by the Erasmus University Medical Center(14) and the Georgetown University-Albert Einstein College of Medicine(15) evaluated the lifetime effects of different risk-tailored screening. Briefly, the models projected the lifetime effects of different screening strategies among the 1985 U.S. female birth cohort. This cohort was carefully chosen to make this analysis relevant for women who are now under the age of 50 years making choices about screening informed by their breast cancer family history and PRS.

The models portrayed breast cancer molecular subtype-specific incidence and mortality based on estrogen receptor (ER) and human epidermal growth factor receptor (HER)2 status.(16) The models included ductal carcinoma in situ (DCIS), where the majority of DCIS progressed to invasive breast cancer, and the rest remained nonlethal as DCIS due to slow progression rates. Screen-detection of breast cancer was modeled using age-, first-screen-, and screening round- and interval-specific digital mammography sensitivity and specificity by breast density group (low [fatty and scattered density] and high [heterogeneous and extremely dense]) based on

Breast Cancer Surveillance Consortium data for women aged 30-74 years.(17) We made the simplifying assumption that the distribution of breast density was independent of PRS and FH status.

Screening benefits such as breast cancer deaths averted or greater survival occurred with tumor detection in earlier stages or at smaller tumor sizes compared to that expected without screening. Screening only occurred in the ages specified by the screening strategy; outside of this screening window, cancers can only be diagnosed due to symptoms. At any time, women diagnosed with breast cancer could die of the disease or competing other-cause mortality. Overdiagnosis was defined as screen-detected DCIS and invasive cases that would not have been detected in the absence of screening because of lack of progressive potential or death from competing mortality. In our past research, biennial screening from ages 50-74 years screening resulted in 40% (Model GE) to 60% (Model E) of DCIS cases being overdiagnosed, (18) with DCIS accounting for 90% of all overdiagnosed cases.

To evaluate the potential efficacy of different screening strategies, the models assumed that all women received genetic testing and, if diagnosed with cancer, received molecular subtype specific adjuvant therapy. Treatment effects on survival by tumor subtype were based on systematically reviews of treatment effectiveness trials.(19) Model details and input parameters are summarized in the Supplementary Methods and Supplementary Tables 1 and 2, model validation has been described elsewhere (13, 16, 20, 21).

Screening strategies

Risk-based digital mammography screening strategies varied by age at initiation (30, 35, 40, 45, 50) and screening interval (annual, biennial, triennial, and hybrid combinations). Hybrid strategies consisted of screening annually before age 50 and biennially starting at age 50 years. We compared the results of these strategies to those expected using three US screening

guidelines, including the United States Preventive Services Task Force (biennial screening in ages 50-74 years), the American College of Radiology (annual screening starting at age 40 years), and the American Cancer Society (annual screening from ages 45-54 years, followed by a choice to continue biennial screening at age 55 years)).(2-4) We made the simplifying assumption that all women in the ACS screening strategy switched to biennial screening at age 55 years, otherwise the ACS and ACR strategies would be identical. While the ACR and ACS guidelines do not specify stopping ages, we used age 74 years as the upper age of screening so that there was comparability across screening approaches. Note that in biennial or triennial strategies starting at age 45- or 55 years, the last screen occurred at age 72- or 73 years, respectively.

Risk stratification based on family history

We defined five family history groups: women who learned in age ranges 30-39, 40-49, 50-64, and 65+ years that they had a first-degree relative with breast cancer; and women with no family history of breast cancer in their lifetimes. The age-specific distribution of family history in the National Health Interview Survey and associated risk levels observed in the Collaborative Breast Cancer Study (CBCS)(22), were used to model breast cancer risk related to family history.(Table 1)

Risk stratification based on polygenic risk

Stratification of women by polygenic risk was based on a PRS for all subtypes combined generated from 313 SNPs. The SNP selection was based on analysis of data from 69 studies and validated in 10 studies from the Breast Cancer Association Consortium.(8) The PRS is based on a multiplicative risk model for the joint effects of the breast cancer SNPs, and is defined as the sum of risk alleles weighted by their effect size as estimated in the combined European ancestry Genome Wide Association Studies (GWAS) data.(8) The performance of this model has been

validated in an external data set and proved to be a reliable predictor of breast cancer risk in women with and without a family history of breast cancer. The area under the receiver operator characteristic curve that measures the discriminatory ability of this PRS is 0.64. The women in the top 1% of the distribution have a predicted risk that is approximately 4-fold larger than the risk in the middle quintile. The lifetime risk of breast cancer in the top 10% of the PRS, was 32.6%.

We modeled the distribution of breast cancer risk relative to the average woman without a family history (RR^*) as a function of polygenic risk and family history and age:

$$RR^* = \text{Lognormal} \left(FHx \left(\mu_i + \frac{\sigma_i}{2} \right) - \left(\frac{\sigma_i}{2} \right)^2, \sigma_i \right)$$

Where FHx is an indicator for first degree family history of breast cancer (yes=1, no=0), μ_i is the log relative risk of family history (adjusted for polygenic effects), and σ_i is the log relative risk associated with a one standard deviation change in the PRS in age group i . The values for μ_i and σ_i were obtained from the original publication by Mavaddat(8) and are included in the Supplementary Table 3. The distribution of breast cancer relative risk as a function of the PRS is displayed in Supplementary Figure 1. We established seven PRS groups spanning risk levels from 0 to 10 times the U.S. population average. Using the cut-off risk levels of the seven defined groups, we calculated the number of women in each risk group.(Table 1)

The breast cancer risk levels and prevalences based on the 313-SNP polygenic risk score and family history status combined are summarized in Table 4 in the Supplementary Material.

Analysis

We examined 47 potential risk-groups: five family history, seven polygenic risk, and 35 combinations of both. First, we estimated the harms (overdiagnoses and false-positives), and benefits (life-years gained and breast cancer deaths averted) of the three comparator screening guidelines (USPSTF, ACS, and ACR). Next, we estimated the harms and benefits of the

screening strategies based on age of initiation (30,35,40,45,50) and interval (annual, biennial, triennial, and hybrid intervals) in each of the 47 risk groups.

To assess the impact of risk-based screening, we analyzed which set of screening strategies maximized the total number of life-years gained under the constraint of maintaining a similar, or better, *ratio* of life-years gained per mammogram as seen with the screening guidelines, i.e., the benchmark. The overall population impact of risk-based screening was quantified by adding the outcomes in the individual risk groups based on their proportions in the population. We used the USPSTF guideline as our base case and included the ACS and ACR guidelines as secondary comparators. Individual model outcomes are included in Tables 5, 6, and 7 in the Supplementary Material.

Sensitivity Analyses

Part of the additional benefits of risk-based screening strategies may accrue simply from an increased number of screens. Therefore, we analyzed what the effects of polygenic risk-based screening would be if the total number of screens were constrained to the number performed in the USPSTF recommendation. All screening strategies were simulated in each PRS group and we assessed the set of strategies that maximized the overall number of life years gained across PRS groups under the fixed number of mammograms constraint.

RESULTS

Breast cancer screening guidelines

If women of average breast cancer risk were screened according to the USPSTF guideline (vs. no screening), the models project an average of 118 life-years gained (model range: 103–133), seven (model range: 6.4–6.9) breast cancer deaths averted, 15 (model range: 12.1–16.9) overdiagnoses, and 920 (model range: 918–921) false positive mammograms per 1,000 women

screened over their lifetimes vs. no-screening. If the ACS or ACR guidelines were followed there were 61% or 178% more mammograms respectively than in the USPSTF guideline, due to early starting ages and more frequent screening, resulting in substantial increases in benefits, but also in harms. (Table 2)

Breast cancer family history

If women with a breast cancer family history started biennial screening at age 40 years (vs. 50) based on the USPSTF guideline, the life-years gained would increase by 36% (model range: 29%-40%) from 168 to 229 LYG, and 20% (model range: 16%-24%) more breast cancer deaths could be averted per 1,000 women screened (Table 3). However, overdiagnoses would increase by 21% (model range: 17%-23%) from 16.8 to 20.3 overdiagnoses, and false positives by 63% (model range: 62%-64%) from 902 to 1468 per 1,000 women screened. Women with a positive family history in their thirties or forties who followed the ACR or ACS guidelines to begin screening in the 40's would have a better ratio of life years gained to overdiagnosis than those who followed the USPSTF guideline (Table 3, Figure 1 and 2).

Polygenic breast cancer risk

In each polygenic risk group, the ACR guideline resulted in the greatest number of life years gained and breast cancer deaths averted since it is the most intensive screening schedule, but this strategy was also associated with more overdiagnoses and false positives than the ACS and USPSTF guidelines. (Table 4) There were several PRS-tailored screening strategies that had comparable or greater benefits than current guidelines, overall increasing LYG by an additional 20% (118 [Table 2] to 141 [Table 5]) and breast cancer deaths averted by 11% (6.7 [Table 2] to 7.4 [Table 5]) compared to the USPSTF guideline. The harms increased by 10% (14.5 to 16.0) more overdiagnoses and 26% (920 to 1156) more false positives.

Benefits increased steeply relative to the USPSTF guideline as polygenic risk increased, so that women with 3-times or higher risk than average could begin screening at age 30 or 35

years, and those with greater than average risk (but < 3-times the risk) could initiate screening at age 40 years. In addition, the lowest risk group could be screened triennially from ages 50-74 years. While these benefits were associated with increased harms, the ratio of benefits to harms was generally more favorable or very similar to that seen for average-risk women under USPSTF guidelines (Table 4)

Polygenic risk and breast cancer family history

Risk stratification using both polygenic risk and family history was estimated to lead to 36 additional life years gained (29% increase), 1.2 fewer breast cancer deaths (18% increase), 2.1 additional overdiagnoses (15% increase) and 1.16 more false positives in a women's lifetime (27% increase) than the USPSTF guideline. (Table 2 & Table 5) Overall, based on benefit to harm ratios, screening based on the combination of family history and polygenic risk generated the maximum life years gained per screen while having the best ratio of LYG to overdiagnosed cases.(Table 5)

Sensitivity Analyses

Without increasing the number of mammograms of the USPSTF recommended screening strategy, polygenic risk-based screening was estimated to slightly increase the population-level benefits and even reduce some of the harms compared to the USPTF guideline (outcomes in Table 5 and screening strategies in Table 6). In this scenario, women in the lowest risk PRS group (0-0.5 the population average) were not screened, women between 0.5 and 2.0 were screened biennially and above a risk of 2.0 hybrid and annual strategies were found to be optimal. Overall across risk groups, these strategies resulted in 17 additional life years gained, 0.4 additional breast cancer deaths averted, 0.5 fewer overdiagnoses and 26 additional false positives compared to the USPSTF guideline.(Table 5)

Discussion

This is the first collaborative modeling study to quantify the effects of tailoring screening based on breast cancer polygenic risk and family history. Compared to current age-based screening guidelines, our results indicate that risk-based screening based on PRS has greater benefits than those based on breast cancer family history only, but combining PRS and family history maximizes improvement in outcomes. Among women with twice the average population breast cancer risk, initiating annual screening before age 50 years is likely to provide greater benefits than harm than seen under US Preventive Service Task Force guideline. Women at the lowest end of the risk spectrum could consider screening at triennial intervals.

Our results extend and are consistent with previous work on risk-based screening based on classical risk factors (23, 24) and prior research in other countries. Vilaprinayo and colleagues performed an analysis using four risk-groups based on breast density, family history, and personal history of breast biopsy to guide screening.(25) Recently, Pashayan used a life-table model to assess risk-based screening in the United Kingdom based on polygenic risk profile.(12) Like our results, both studies concluded that risk-based screening strategies had greater benefit to harm ratios than age-based screening.

While our findings, and the results of others lend support to risk-based breast cancer screening, our approach was unique in evaluating whether the associated increases in benefits of risk-based screening were merely attributable to more screening examinations. When we constrained the number of mammograms, the benefits of risk-based screening moderately persisted and overdiagnoses decreased compared to those seen with the USPSTF guideline. This suggests that allocation of mammography resources across age groups based on risk would be an efficient approach to maximize the benefits of screening programs.

Implementing breast cancer screening based on polygenic risk and family history status would require a one-time saliva sample to determine polygenic risk. The result, together with a questionnaire about family history could assist women in making choices about more

personalized screening options. Ethical aspects of genetic testing such as patient autonomy, accessibility, and increased worry about screening outcomes should be considered before the implementation of polygenic risk-based screening strategies.

While cost-effectiveness analysis is beyond the scope of this paper, the current commercial laboratory cost of polygenic risk testing is currently \$100-\$150. This cost is expected to decrease with technology advances and economies of scale. The ultimate feasibility of implementing risk-based screening will depend in part on how much the added costs of testing, counseling and screening will be offset by savings from less screening in low-risk women and decreases in costs of cancer care from earlier diagnoses among women destined to develop breast cancer.

This study has several important strengths including consistent results across two well-established simulation models, use of U.S. national data, and evaluation of a 313-SNP PRS and family history information to personalize breast cancer screening. There are also several caveats that should be considered in evaluating the results. First, we did not explicitly model the effects of rare, but higher risk variants in genes such as BRCA1, BRCA2, PALB2, CHEK2 or ATM which are particularly relevant among young women under the age of 50 years. Carriers of high-risk mutations in these genes are typically advised to undergo annual screening with both MRI and mammography.(26) Second, while we account for tumor natural history by ER/HER2 status, the models assumed that polygenic risk did not directly affect tumor progression (27, 28), or mode of detection (29). Third, we did not consider screening after age 74 years or costs and quality adjusted life years. These will be important to include in future research. Fourth, we did not consider risk related to second degree family members with breast cancer due to data limitations. Fifth, to test the efficacy of risk-based screening, we assumed perfect uptake of genetic testing, screening, and receipt of treatment. Actual population impact will be lower. Sixth, the effectiveness of screening in combination with treatment in women under age 40 years

has been assessed in case-control studies, but not in a randomized controlled trial. Finally, while we considered the effects of breast density on mammography performance, it will be important to conduct future analyses that consider joint distributions of breast density, PRS and family history as data evolves

Overall, this study demonstrated that compared to following general population guideline strategies for women of average risk, risk-tailored screening has the potential to prevent more breast cancer deaths and extend lives for identifiable groups of women at high risk due to their breast cancer family history and polygenic risk.

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NOTES

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DATA AVAILABILITY

The Breast Cancer Surveillance Consortium (BCSC) investigators, provided the de-identified and aggregated data of participating women in mammography facilities in the United States that were used to inform the breast cancer simulation models in this study. The collection of cancer and vital status data from the BCSC was supported in part by several state public health departments and cancer registries throughout the US. For a full description of these sources, please see: <http://breastscreening.cancer.gov/work/acknowledgement.html> A list of the BCSC investigators is provided at: <http://breastscreening.cancer.gov/>. The Institutional Review Board at Georgetown University approved the study as exempt based on the use of de-identified data. Other data that was used to inform the models has been described in the supplementary material in Supplementary Table 2.

References

1. Independent U. K. Panel on Breast Cancer Screening. The benefits and harms of breast cancer screening: an independent review. *Lancet*. 2012;380(9855):1778-86.
2. Siu AL, On behalf of the U. S. Preventive Services Task Force. Screening for Breast Cancer: U.S. Preventive Services Task Force Recommendation Statement. *Ann Intern Med*. 2016;164(4):279-96.
3. Monticciolo DL, Newell MS, Hendrick RE, Helvie MA, Moy L, Monsees B, et al. Breast Cancer Screening for Average-Risk Women: Recommendations From the ACR Commission on Breast Imaging. *J Am Coll Radiol*. 2017;14(9):1137-43.
4. Oeffinger KC, Fontham ET, Etzioni R, Herzig A, Michaelson JS, Shih YC, et al. Breast Cancer Screening for Women at Average Risk: 2015 Guideline Update From the American Cancer Society. *JAMA*. 2015;314(15):1599-614.
5. Collaborative Group on Hormonal Factors in Breast C. Familial breast cancer: collaborative reanalysis of individual data from 52 epidemiological studies including 58,209 women with breast cancer and 101,986 women without the disease. *Lancet*. 2001;358(9291):1389-99.
6. Thompson D, Easton D. The genetic epidemiology of breast cancer genes. *Journal of mammary gland biology and neoplasia*. 2004;9(3):221-36.
7. Easton DF, Pharoah PD, Antoniou AC, Tischkowitz M, Tavitgian SV, Nathanson KL, et al. Gene-panel sequencing and the prediction of breast-cancer risk. *N Engl J Med*. 2015;372(23):2243-57.
8. Mavaddat N, Michailidou K, Dennis J, Lush M, Fachal L, Lee A, et al. Polygenic Risk Scores for Prediction of Breast Cancer and Breast Cancer Subtypes. *Am J Hum Genet*. 2019;104(1):21-34.
9. Pharoah PD, Antoniou AC, Easton DF, Ponder BA. Polygenes, risk prediction, and targeted prevention of breast cancer. *N Engl J Med*. 2008;358(26):2796-803.
10. Burton H, Chowdhury S, Dent T, Hall A, Pashayan N, Pharoah P. Public health implications from COGS and potential for risk stratification and screening. *Nat Genet*. 2013;45(4):349-51.
11. Esserman LJ, Study W, Athena I. The WISDOM Study: breaking the deadlock in the breast cancer screening debate. *NPJ Breast Cancer*. 2017;3:34.

12. Pashayan N, Morris S, Gilbert FJ, Pharoah PDP. Cost-effectiveness and Benefit-to-Harm Ratio of Risk-Stratified Screening for Breast Cancer: A Life-Table Model. *JAMA Oncol.* 2018.
13. Mandelblatt JS, Stout NK, Schechter CB, van den Broek JJ, Miglioretti DL, Krapcho M, et al. Collaborative Modeling of the Benefits and Harms Associated With Different U.S. Breast Cancer Screening Strategies. *Ann Intern Med.* 2016;164(4):215-25.
14. van den Broek JJ, van Ravesteyn NT, Heijnsdijk EA, de Koning HJ. Estimating the effects of risk-based screening and adjuvant treatment using the MISCAN-Fadia continuous tumor growth model for breast cancer. *Medical Decision Making.* 2018.
15. Schechter CB, Near AM, Jayasekera J, Chang Y, Mandelblatt JS. Structure, Function, and Applications of the Georgetown-Einstein (GE) Breast Cancer Simulation Model *Medical Decision Making.* 2018.
16. Plevritis SK, Munoz D, Kurian AW, Stout NK, Alagoz O, Near AM, et al. Association of Screening and Treatment With Breast Cancer Mortality by Molecular Subtype in US Women, 2000-2012. *JAMA.* 2018;319(2):154-64.
17. Lehman CD, Arao RF, Sprague BL, Lee JM, Buist DS, Kerlikowske K, et al. National Performance Benchmarks for Modern Screening Digital Mammography: Update from the Breast Cancer Surveillance Consortium. *Radiology.* 2017;283(1):49-58.
18. van Ravesteyn NT, van den Broek JJ, Li X, Weedon-Fekjaer H, Schechter CB, Alagoz O, et al. Modeling Ductal Carcinoma In Situ (DCIS): An Overview of CISNET Model Approaches. *Med Decis Making.* 2018;38(1_suppl):126S-39S.
19. Early Breast Cancer Trialists' Collaborative G, Peto R, Davies C, Godwin J, Gray R, Pan HC, et al. Comparisons between different polychemotherapy regimens for early breast cancer: meta-analyses of long-term outcome among 100,000 women in 123 randomised trials. *Lancet.* 2012;379(9814):432-44.
20. van den Broek JJ, van Ravesteyn NT, Mandelblatt JS, Huang H, Ergun MA, Burnside ES, et al. Comparing CISNET Breast Cancer Incidence and Mortality Predictions to Observed Clinical Trial Results of Mammography Screening from Ages 40 to 49. *Med Decis Making.* 2018;38(1_suppl):140S-50S.

21. Mandelblatt JS, Near AM, Miglioretti DL, Munoz D, Sprague BL, Trentham-Dietz A, et al. Common Model Inputs used in CISNET Collaborative Breast Cancer Modeling Medical Decision Making. 2018.
22. Shiyanbola OO, Arao RF, Miglioretti DL, Sprague BL, Hampton JM, Stout NK, et al. Emerging Trends in Family History of Breast Cancer and Associated Risk. *Cancer Epidemiol Biomarkers Prev.* 2017;26(12):1753-60.
23. Trentham-Dietz A, Kerlikowske K, Stout NK, Miglioretti DL, Schechter CB, Ergun MA, et al. Tailoring Breast Cancer Screening Intervals by Breast Density and Risk for Women Aged 50 Years or Older: Collaborative Modeling of Screening Outcomes. *Ann Intern Med.* 2016;165(10):700-12.
24. van Ravesteyn NT, Miglioretti DL, Stout NK, Lee SJ, Schechter CB, Buist DS, et al. Tipping the balance of benefits and harms to favor screening mammography starting at age 40 years: a comparative modeling study of risk. *Ann Intern Med.* 2012;156(9):609-17.
25. VilaprinYO E, Forne C, Carles M, Sala M, Pla R, Castells X, et al. Cost-effectiveness and harm-benefit analyses of risk-based screening strategies for breast cancer. *PLoS One.* 2014;9(2):e86858.
26. Paluch-Shimon S, Cardoso F, Sessa C, Balmana J, Cardoso MJ, Gilbert F, et al. Prevention and screening in BRCA mutation carriers and other breast/ovarian hereditary cancer syndromes: ESMO Clinical Practice Guidelines for cancer prevention and screening. *Ann Oncol.* 2016;27(suppl 5):v103-v10.
27. Shimelis H, LaDuca H, Hu C, Hart SN, Na J, Thomas A, et al. Triple-Negative Breast Cancer Risk Genes Identified by Multigene Hereditary Cancer Panel Testing. *J Natl Cancer Inst.* 2018.
28. Milne RL, Kuchenbaecker KB, Michailidou K, Beesley J, Kar S, Lindstrom S, et al. Identification of ten variants associated with risk of estrogen-receptor-negative breast cancer. *Nat Genet.* 2017;49(12):1767-78.
29. Li J, Ugalde-Morales E, Wen WX, Decker B, Eriksson M, Torstensson A, et al. Differential Burden of Rare and Common Variants on Tumor Characteristics, Survival, and Mode of Detection in Breast Cancer. *Cancer Res.* 2018;78(21):6329-38.

TABLES

Table 1. Prevalence and risk level according to family history of breast cancer and the 313-SNP polygenic risk score.

Breast cancer risk and prevalence	Breast cancer relative risk level (95% CI)	% of all women
Family history (FH) age groups*		
FH positive between 30 and 39	2.19 (1.72 to 2.77)	4.7
FH positive between 40 and 49	1.73 (1.74 to 1.93)	4.2
FH positive between 50 and 64	1.39 (1.30 to 1.48)	5.9
FH positive at age 65 or older	1.34 (1.23 to 1.46)	2.3
No positive FH in life	0.79 (0.67 to 0.91)	82.9
Polygenic risk groups †		
Polygenic risk group 1	$0.0 < PRS \leq 0.5$	13.2
Polygenic risk group 2	$0.5 < PRS \leq 1.0$	46.7
Polygenic risk group 3	$1.0 < PRS \leq 1.5$	25.3
Polygenic risk group 4	$1.5 < PRS \leq 2.0$	9.3
Polygenic risk group 5	$2.0 < PRS \leq 3.0$	4.7
Polygenic risk group 6	$3.0 < PRS \leq 5.0$	0.7
Polygenic risk group 7	$5.0 < PRS \leq 10.0$	0.0

* Breast cancer risk data by family history status come from the Collaborative Breast Cancer Study.(22) A positive first-degree family history was modeled as an increase in risk at the first age-year of each age-group. Risk is age-specific and relative to the population average in which some women, but most women don't have a breast cancer family history. Thus, women in the "No positive FH in life" have a relative risk below the population average of 1.

† Seven risk groups were established based on the 313-SNP polygenic risk score. For example, women in the $1.5 < PRS \leq 2.0$ group have a 1.5 to 2.0 increased risk of developing breast cancer compared to the population average due to their polygenic risk.

Table 2. Model average benefits, harms, and benefit to harm ratios for digital mammography screening by guideline groups for average risk women per 1,000 women screened.

Screening guideline*	Screening strategy	Number of screens	Life years gained(LYG)) †	Breast cancer (BC) deaths averted†	Over diagnoses	False positives	LYG/screens	LYG/overdiagnoses	BC deaths averted/false positives
United States Preventive Services Task Force	Biennial 50-74	11182	118	6.7	14.5	920	0.0106	8.14	0.0072
American College of Radiology	Annual 40-74	31083	192	9.6	21.5	2910	0.0062	8.94	0.0033
American Cancer Society	An 45-54, Bi 55-74	17984	151	7.7	16.5	1666	0.0084	9.16	0.0046

* We used age 74 as the age of the last possible screen for comparability across screening strategies for all analyses.

† The life-years gained and breast cancer deaths averted are relative to the life-years and breast cancer deaths of women at the same level of age-specific breast cancer risk who are never screened.

Table 3. Model average benefits, harms, and benefit to harm ratios for screening based on breast cancer family history per 1,000 women screened.

Risk group based on breast cancer family history †	Screening based on	Screening strategy	No. of screens	LYG*	BC deaths averted*	Over diagnoses	False positives	LYG/screens	LYG/overdiagnoses/	BC deaths averted/false positives
Positive FH ages 30-39	USPSTF	Biennial 50-74	10814	168	9.3	16.5	892	0.0156	10.18	0.0104
	ACS	An 45-54, Bi 55-74	17499	222	11.0	19.2	1622	0.0127	11.51	0.0068
	ACR	Annual 40-74	30173	284	13.7	25.6	2830	0.0094	11.09	0.0049
	BC family history	Biennial 30-74	20528	254	11.9	21.7	2079	0.0124	11.73	0.0057
Positive FH ages 40-49	USPSTF	Biennial 50-74	10904	168	9.3	16.7	901	0.0154	10.03	0.0104
	ACS	An 45-54, Bi 55-74	17635	221	11.0	19.4	1635	0.0125	11.34	0.0067
	ACR	Annual 40-74	30406	280	13.6	25.9	2851	0.0092	10.79	0.0048
	BC family history	Biennial 40-74	15713	229	11.3	20.3	1468	0.0145	11.28	0.0077

* The life-years gained and breast cancer deaths averted are relative to the life-years and breast cancer deaths of women at the same level of age-specific breast cancer risk who are never screened. BC = breast cancer; LYG = life-years gained;

† The primary analysis focuses on screening decisions among women under the age of 50. Outcomes among women with a breast cancer family history after age 50 are included in the supplementary material.

Table 4. Model average benefits, harms, and benefit to harm ratios for screening based on polygenic risk per 1,000 women screened.

Risk group based on polygenic risk score†	Screening based on	Screening strategy	No. of screens	LYG*	BC deaths averted*	Over diagnoses	False positives	LYG/screens	LYG/overdiagnoses	BC deaths averted/false positives
PRS7 (5.0 < RR < 10.0)	USPSTF	Biennial 50-74	8886	513	27.5	28.0	726	0.0577	18.30	0.0378
	ACS	An 45-54, Bi 55-74	15054	685	33.1	35.2	1404	0.0455	19.45	0.0236
	ACR	Annual 40-74	25587	863	40.4	48.2	2432	0.0337	17.89	0.0166
	Polygenic risk	Annual 30-74	35214	959	42.8	53.3	3648	0.0272	18.00	0.0117
PRS6 (3.0 < RR < 5.0)	USPSTF	Biennial 50-74	9897	352	19.3	24.8	811	0.0355	14.17	0.0238
	ACS	An 45-54, Bi 55-74	16369	459	22.7	29.7	1522	0.0280	15.48	0.0149
	ACR	Annual 40-74	28007	578	27.8	40.4	2644	0.0206	14.31	0.0105
	Polygenic risk	Annual 35-74	32835	616	28.9	42.6	3254	0.0188	14.48	0.0089
PRS5 (2.0 < RR < 3.0)	USPSTF	Biennial 50-74	10469	252	14.0	21.0	859	0.0240	11.98	0.0162
	ACS	An 45-54, Bi 55-74	17096	325	16.3	24.6	1587	0.0190	13.21	0.0102
	ACR	Annual 40-74	29373	408	20.0	33.2	2763	0.0139	12.31	0.0072
	Polygenic risk	An40-50,bi50-74	19574	359	17.2	26.2	1955	0.0183	13.68	0.0088
PRS4 (1.5 < RR < 2.0)	USPSTF	Biennial 50-74	10845	183	10.2	17.7	891	0.0169	10.34	0.0115
	ACS	An 45-54, Bi 55-74	17566	234	11.9	20.4	1629	0.0133	11.47	0.0073
	ACR	Annual 40-74	30268	295	14.6	27.2	2839	0.0097	10.87	0.0051
	Polygenic risk	Biennial 40-74	15646	242	12.1	21.2	1463	0.0154	11.39	0.0083
PRS3 (1.0 < RR < 1.5)	USPSTF	Biennial 50-74	11091	137	7.7	15.2	912	0.0123	8.98	0.0084
	ACS	An 45-54, Bi 55-74	17873	174	8.8	17.3	1656	0.0097	10.06	0.0053
	ACR	Annual 40-74	30856	219	10.9	22.8	2890	0.0071	9.63	0.0038
	Polygenic risk	Biennial 40-74	15923	180	9.1	18.2	1487	0.0113	9.92	0.0061
PRS3 (0.5 < RR < 1.0)	USPSTF	Biennial 50-74	11333	90	5.1	12.4	932	0.0079	7.29	0.0055
	ACS	An 45-54, Bi 55-74	18171	115	5.9	14.0	1683	0.0063	8.18	0.0035
	ACR	Annual 40-74	31430	144	7.2	18.0	2939	0.0046	8.02	0.0024
	Polygenic risk	Biennial 50-74	11333	90	5.1	12.4	932	0.0079	7.29	0.0055
PRS3 (0.0 < RR < 0.5)	USPSTF	Biennial 50-74	11588	40	2.3	9.1	953	0.0035	4.42	0.0024
	ACS	An 45-54, Bi 55-74	18484	51	2.6	10.2	1710	0.0027	4.98	0.0015
	ACR	Annual 40-74	32037	64	3.2	12.4	2991	0.0020	5.16	0.0011
	Polygenic risk	Triennial 50-74	8020	34	1.9	8.3	705	0.0042	4.10	0.0027

*The life-years gained and breast cancer deaths averted are relative to the life-years and breast cancer deaths of women at the same level of risk who are never screened. BC = breast cancer; LYG = life-years gained; RR = relative risk.

Table 5. Model average benefits, harms, and benefit to harm ratios comparison of risk-based screening based on breast cancer family history, polygenic risk score, and family history combined with polygenic risk – for both the primary analysis and the sensitivity analysis.

Risk-based screening outcomes	Screening based on	Number of screens	Life years gained (LYG)	Breast cancer (BC) deaths averted	Over diagnoses	False positives	LYG/screens	LYG/overdiagnoses/	BC deaths averted/false positives
Main analyses									
Risk-based	Family history (Strategies in Table 3)	11840	125	6.9	14.9	1000	0.0105	8.35	0.0069
Risk-based	Polygenic risk (Strategies in Table 4)	12990	141	7.4	16.0	1156	0.0109	8.85	0.0064
Risk-based	Family history & polygenic risk *	13089	154	7.9	16.6	1169	0.0117	9.23	0.0067
Sensitivity analysis									
Risk-based (constrained) †	Polygenic risk (Strategies in Table 6)	10856	135	7.1	14.0	946	0.0124	9.64	0.0075

* Results per 1,000 women screened. The screening strategies and associated harms and benefits are listed in Table 6 of the Supplementary Material.

† The constrained risk-based screening approach represents a scenario where the number of screens of the USPSTF screening guidelines (top row) was not increased, but rather was redistributed across the population based on the polygenic risk scores (strategies given in Table 6). The number of screens do not exactly match because all women in each risk group were assigned to one of screening strategies listed in the methods section.

Table 6. Screening strategies used in the sensitivity analysis.

Polygenic risk group	Screening strategy *
Polygenic risk group 1 (0.0 < Relative Risk < 0.5)	No screening
Polygenic risk group 2 (0.5 < Relative Risk < 1.0)	Biennial 50-74
Polygenic risk group 3 (1.0 < Relative Risk < 1.5)	Biennial 45-74
Polygenic risk group 4 (1.5 < Relative Risk < 2.0)	Biennial 45-74
Polygenic risk group 5 (2.0 < Relative Risk < 3.0)	† Hybrid 40-74
Polygenic risk group 6 (3.0 < Relative Risk < 5.0)	† Hybrid 40-74
Polygenic risk group 7 (5.0 < Relative Risk < 10.0)	Annual 30-74

* The set of screening strategies in this column followed from a constrained optimization that maximized the overall number of life years gained by simulating all combinations of screening strategies under the overall constraint of using not more mammograms as seen in the USPSTF guideline.

† The hybrid consists of annual screening from ages 40-49 years and biennial screening from ages 50-74 years.

FIGURE TITLES AND LEGENDS

Figure 1. The number of mammograms and life years gained associated with different screening strategies among women who learned at age 40 about a positive first-degree family member with breast cancer. Results from exemplary Model E per 1,000 women screened. The estimated harms and benefits associated with these screening strategies are displayed in Figure 2. The underlined strategies are the commonly followed guidelines of the United States Preventive Services Task Force (USPSTF), the American Cancer Society (ACS), and the American College of Radiology (ACR).

Figure 2. Harms and benefits associated with different screening strategies among women who learned at age 40 about a positive first-degree family member with breast cancer. Estimates of Model E per 1,000 women screened. The underlined strategies are the commonly followed guidelines of the United States Preventive Services Task Force (USPSTF), the American Cancer Society (ACS), and the American College of Radiology (ACR). The figure shows A) Life years gained vs. overdiagnosed breast cancers; B) breast cancer deaths averted vs. overdiagnosed breast cancers; C) life years gained vs. false positive mammograms; and D) breast cancer deaths averted vs. false positive mammograms.

Figure 1

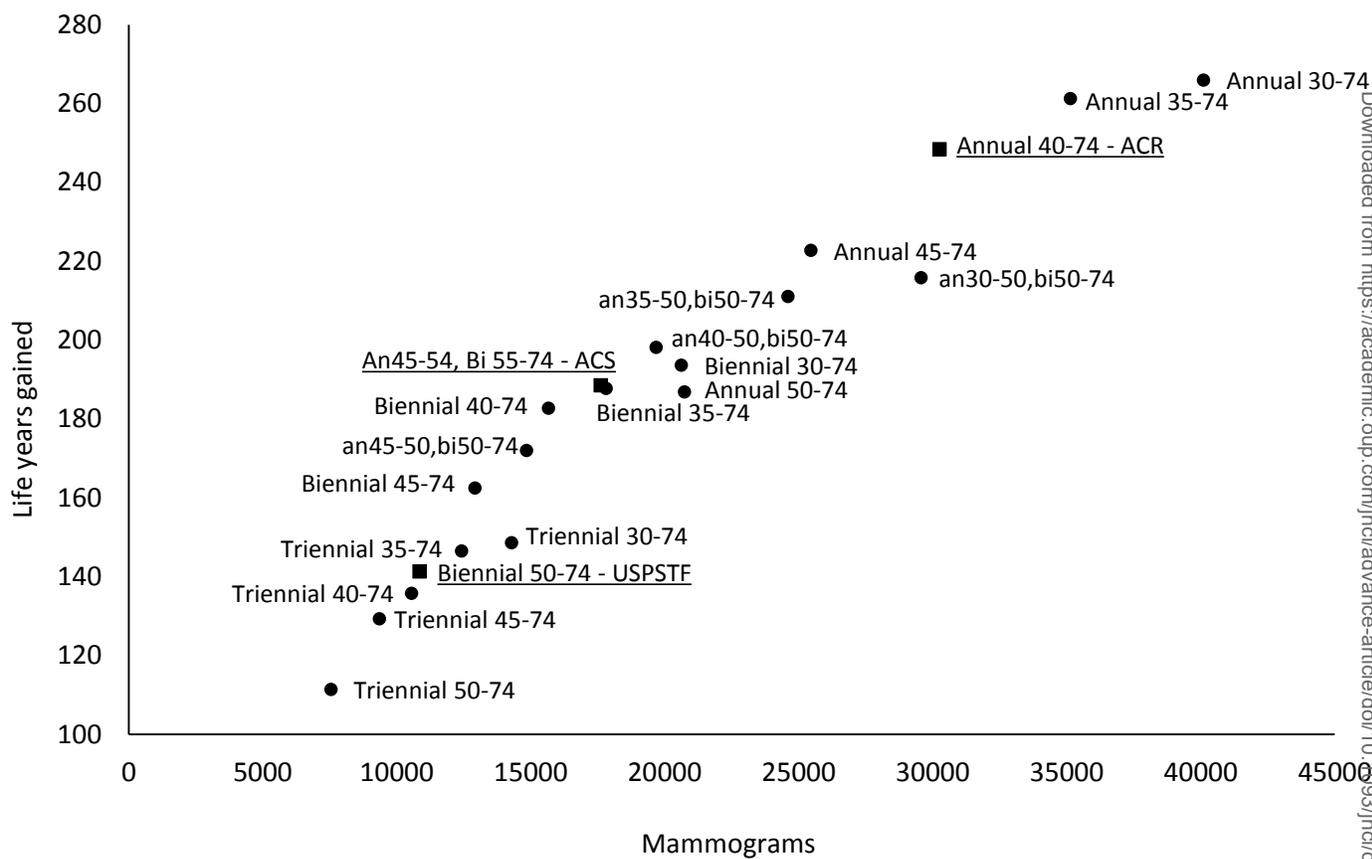
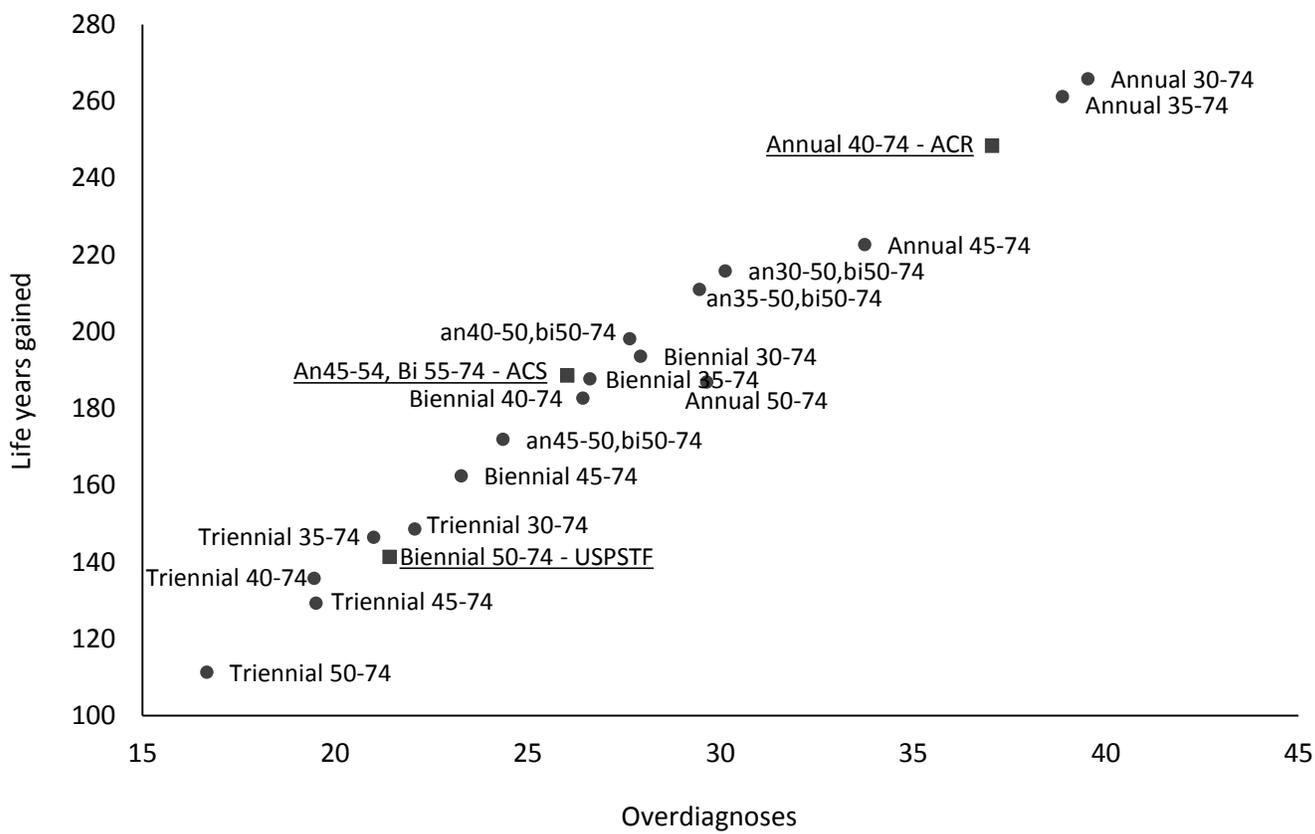


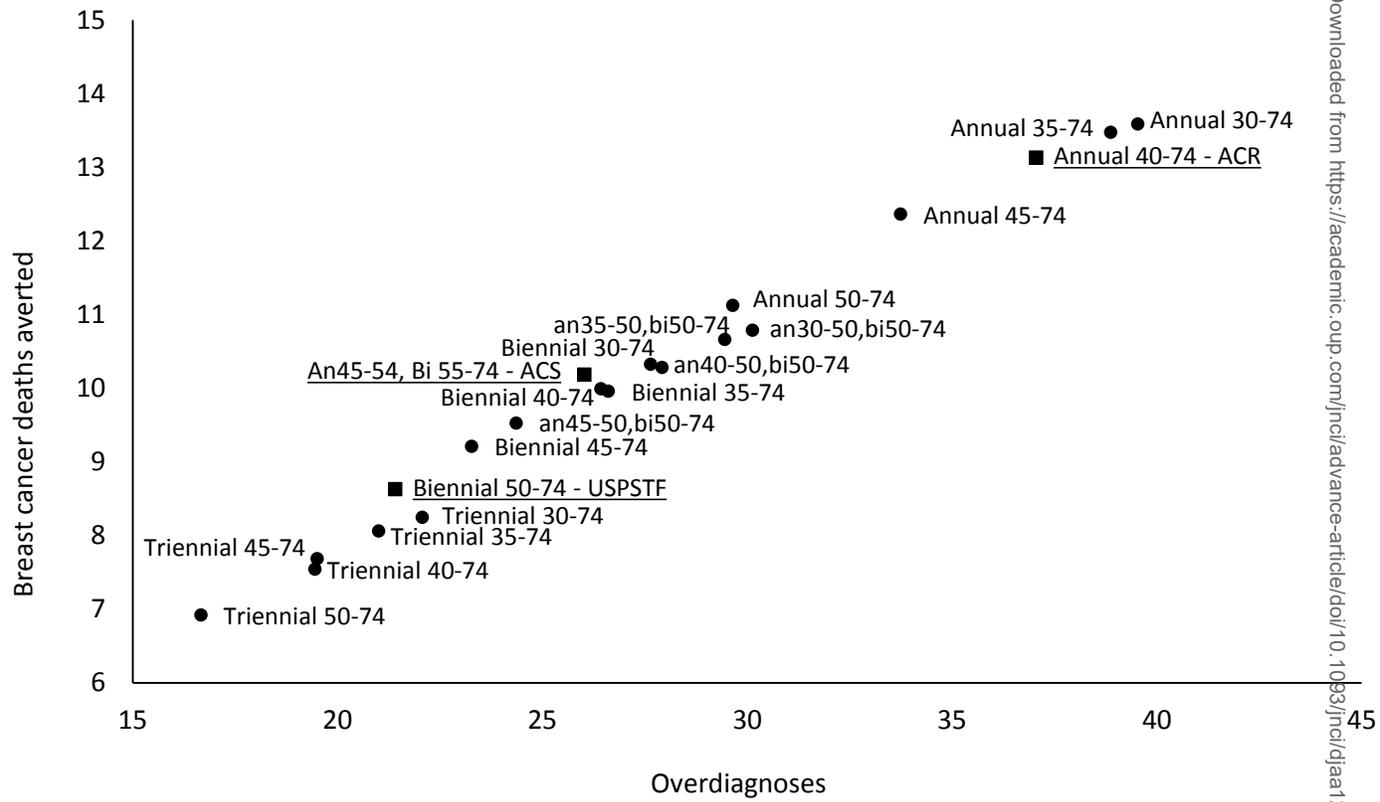


Figure 2

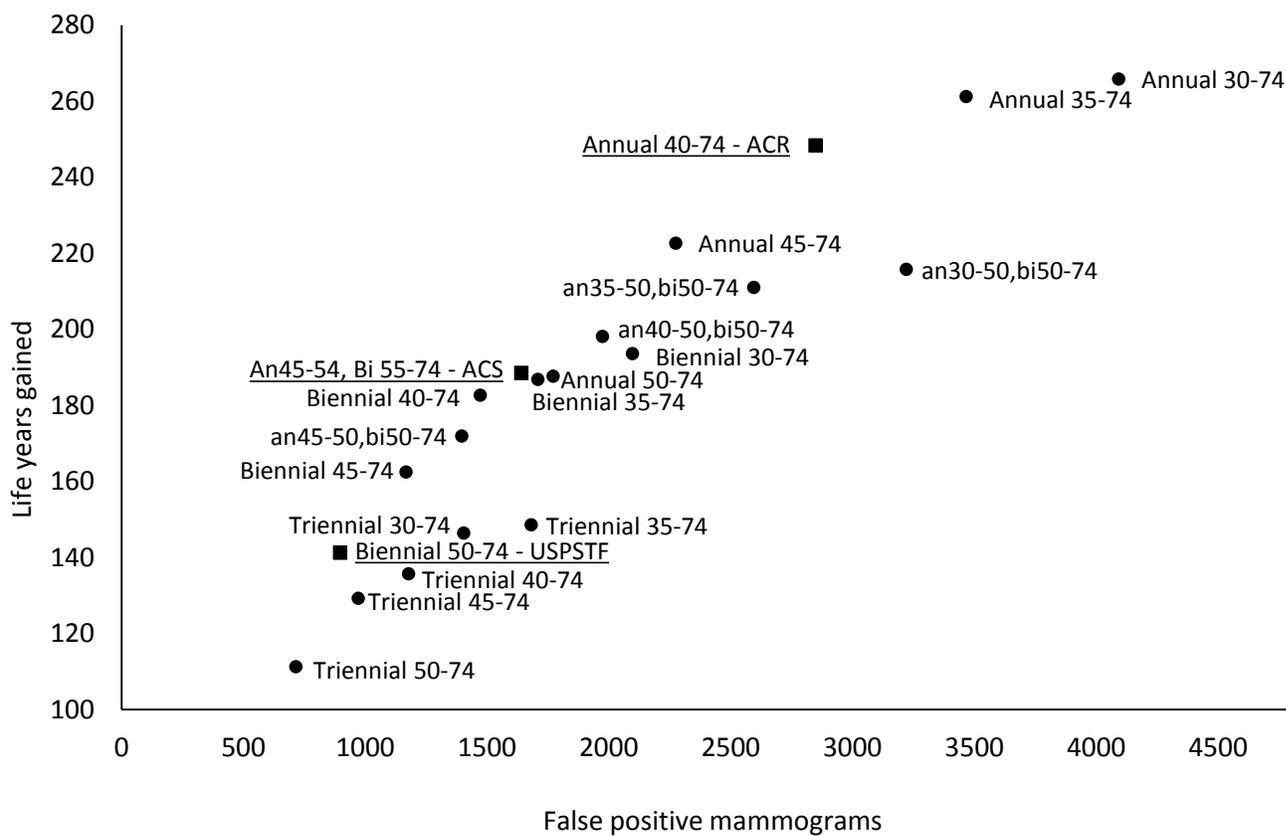
A



B



C



D

