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Title: Gene expression profiling and expanded immunohistochemistry tests to guide selection of chemotherapy regimens in breast cancer management: a systematic review.

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Running Head: GEP and expanded IHC tests in breast cancer management.

Abstract

OBJECTIVES: The aim of this report was to assess the clinical effectiveness of two Gene expression profiling (GEP) and two expanded immunohistochemistry (IHC) tests compared with current prognostic tools in guiding the use of adjuvant chemotherapy in patients with early breast cancer.

METHODS: A systematic review of the evidence on clinical effectiveness of OncotypeDX, IHC4, MammaPrint and Mammostrat, compared with current clinical practice using clinicopathological parameters, in women with early breast cancer was conducted. Ten databases were searched to include citations to May 2016.

RESULTS: Searches identified 7064 citations, of which 41 citations satisfied the criteria for the review. A narrative synthesis was performed. Evidence for OncotypeDX demonstrated the impact of the test on decision-making and there was some support for OncotypeDX predicting chemotherapy benefit. There were relatively lower levels of evidence for the other three tests included in the analysis. MammaPrint, Mammostrat and IHC4 tests were limited to a small number of studies. Limitations in relation to study design were identified for all tests.

CONCLUSIONS: The evidence base for OncotypeDX is considered to be the most robust. Methodological weaknesses relating to heterogeneity of patient cohorts and issues arising from the retrospective nature of the evidence were identified. Further evidence is required for all of the tests using prospective randomised controlled trial data.

Keywords: Gene expression profiling; Immunohistochemistry; breast cancer.

Acknowledgements

This is an updated version of a review which was originally undertaken to inform the UK National Institute for Health and Clinical Excellence's (NICE) assessment of GEP (MammaPrint, OncotypeDX, Mammostrat) and IHC (IHC4) tests to guide selection of chemotherapy regimens in breast cancer management. Funding for that study was provided by the Health Technology Assessment programme of the National Institute for Health Research.

Introduction

Breast cancer is not a single disease but rather a group of heterogeneous tumours at the molecular level(1). Based on the knowledge that certain biological features of cancers may indicate an increased likelihood of rapid growth and metastasis (in particular, distant recurrence) gene expression profiling (GEP) and expanded immunohistochemistry (IHC) (or protein expression) tests have been developed.

These tests have an aim of improving the targeting of chemotherapy in breast cancer by stratifying patients and identifying those patients who will gain most benefit from adjuvant chemotherapy. These tests either measure the risk of cancer recurrence (by incorporating a wider range of biomarkers with prognostic significance than standard clinico-pathological algorithms), or aim to identify breast cancer sub-types which may influence recurrence risk and guide treatment decisions.

In current practice treatment regimens are tailored according to traditional clinical characteristics such as age, tumour size and grade together with a tumour's molecular signature based on estrogen (ER) and progesterone (PR) receptor status and HER2 receptor status(2), although guidelines may differ slightly from country to country.

The purpose of this systematic review was to evaluate the clinical effectiveness of GEP and expanded IHC tests in guiding the use of adjuvant chemotherapy in women with early breast cancer. A summary of the evaluated gene expression profiling and expanded immunohistochemistry tests is presented in Table 1. This review was originally undertaken to inform the UK National Institute for Health and Care Excellence's (NICE) assessment of GEP (MammaPrint, OncotypeDX) and IHC

(IHC4 and Mammostrat) tests to guide selection of chemotherapy regimens in breast cancer management(3), but has been updated with new evidence up to May 2016.

Table 1 here

Method

A systematic review of the evidence was undertaken according to the general principles recommended in the Centre for Reviews and Dissemination (CRD)(4) guidance for undertaking systematic reviews, and reported according to the Preferred Reporting Items for Systematic Reviews and Meta-Analysis (PRISMA) statement(5), and The NICE Diagnostic Assessment Programme Interim Methods Statement(6).

Data sources and searches

Ten electronic databases were searched, these were: Medline and Medline in Process via Ovid SP, Embase via Ovid SP; Cochrane Library databases all via Wiley: Cochrane Central Register of Controlled Trials (CENTRAL), Cochrane Database of Systematic Reviews (CDSR), Database of Abstracts of Reviews of Effects (DARE), Health Technology Assessment Database (HTA), NHS Economic Evaluation Database(NHS-EED); Web of Science databases all via Thomson Reuters: BIOSIS Previews, Science Citation Index Expanded (SCI-Expanded) and the Conference Proceedings Citation Index- Science (CPCI-S).

The search strategy used free text and thesaurus terms and combined breast cancer related synonyms (e.g. breast neoplasm) with terms related to gene expression profiling tests or biomarkers (e.g. MammaPrint or "gene?twentyone"). A publication

date limit of January 2002 was applied. This was the date that the longest standing test used in the review had been devised, as confirmed by manufacturers' submissions to NICE as part of the original review, and therefore it would not be possible for evidence to predate this. For the OncotypeDX and MammaPrint test, the current review used two previous systematic reviews(7,8) to identify included studies, thus the searches were limited from January 2009 (last date from earlier reviews) for these tests. Although a number of other systematic reviews examining GEP tests have been reported, these reviews(7,8) were considered the most appropriate reviews to update. The reviews were assessed as being of high quality, and in particular the search strategies were assessed as being complete. No other limits were applied to the searches. An update search was conducted in Medline and Medline in Process from January 2013 - May 2016.

Supplementary search techniques were also undertaken to augment the topic searches, these included hand searching of relevant journals, citation searches of included papers in the review, searching of conference proceedings, and finally experts in the field were contacted to ask for suggestions for relevant evidence for the project.

Study selection

The inclusion of potentially relevant articles was undertaken using a two-stage process. First, all titles and abstracts were screened for inclusion, followed by the assessment of full manuscripts. Both stages were undertaken by one reviewer and any uncertainties in the selection process were resolved through discussion with another reviewer. All study designs were included. Eligible studies included adult patients diagnosed with early invasive breast cancer. The index test included

OncotypeDX, MammaPrint, IHC4 or Mammostrat. The comparator was standard care and could include the use of Adjuvant! Online (AoL) and/or the Nottingham Prognostic Index (NPI), to predict the risk of recurrence and survival for patients with early breast cancer. The outcome measure was clinical utility (the test's ability to discriminate between those who will have more or less benefit from a therapeutic intervention) (7,8). Specifically, (i) the ability of the test to predict treatment effect with adjuvant chemotherapy, and (ii) to what extent are test results used in treatment decisions. Studies published in languages other than English (unless no other comparable data existed) were excluded. Abstracts were considered but only included if they represented significant new knowledge, such as prospective RCT evidence.

Data extraction and quality assessment

Data relating to study design, methodological quality, and outcomes, were extracted by one reviewer into a standardised data extraction form and independently checked for accuracy by a second. Discrepancies were resolved by discussion. The methodological quality of each included study was assessed by two reviewers according to the criteria recommended by Altman (2001)(9) for assessing the internal validity of prognostic (predictive factor) studies.

Data synthesis and analysis

Although a meta-analysis was planned, this was not considered appropriate due to a high degree of heterogeneity e.g. study populations, outcomes and diagnostic

thresholds between and within studies. Therefore, data were tabulated and discussed in a narrative review.

Results

PRISMA flow

Figure 1 summarises the process of identifying and selecting relevant literature. Of the 7064 citations identified, 29 new studies (30 citations) were identified and were added to the 11 studies from the previous systematic reviews.

Figure 1 about here

Study and patient characteristics

Forty studies (41 citations) were included in the review. All studies were published between 2002 and May 2016.

Most of the evidence was related to the OncotypeDX (32 studies). Four studies related to the prediction of treatment effect with adjuvant chemotherapy, with the remaining 28 studies relating to evidence on the test result leading to changes in treatment decisions. Six studies were identified for MammaPrint, all relating to evidence on the test result leading to changes in treatment decisions. Only one relevant study was identified for IHC4, and one for Mammostrat. The IHC4 study provided evidence relating to the test leading to changes in treatment decisions, whereas the Mammostrat study provided evidence on the prediction of treatment effect with adjuvant chemotherapy. Details of the study and patient characteristics, together with key findings of the included studies are provided in Tables 2 and 3.

Quality Assessment

Limitations in the clinical data were identified for all tests. No studies had a prospective, randomised controlled trial (RCT) design and only five studies included a prospective analysis of archived tissue samples from a previous RCT (OncotypeDX n=4; Mammostrat n=1). For the four OncotypeDX studies and the one Mammostrat study providing evidence relating to the prediction of treatment effect with adjuvant chemotherapy, the overall risk of bias was judged to be moderate, although retrospective analysis of archived tissue samples, the evidence was derived from relatively large scale RCTs. The remaining 28 OncotypeDX studies providing evidence relating to changes in treatment recommendations, were in the main, small scale studies (n=25-979). Fifteen were retrospective in study design, and some (n=14) did not provide full details of the patient characteristics. Similarly, of the six studies identified for MammaPrint two were retrospective in study design, and some were lacking full details of patient characteristics. The IHC4 study was prospective in design, however the sample size was relatively small (n=124). Overall, particularly for the studies relating to evidence of the tests leading to changes in treatment decisions, there was a high level of clinical heterogeneity across studies both within each test and across the four tests.

Table 2 here

Table 3 here

Narrative data synthesis

Prediction of treatment effect with adjuvant chemotherapy

<u>OncotypeDX</u>

Studies by Paik, Tang and Shak et al.(10), Albain, Barlow and Shak et al.(11), Tang, Shak and Paik et al.(12) and Tang, Constantino and Crager et al.(13) assessed the predictive ability of OncotypeDX using archived tissue samples collected during randomised controlled trials comparing tamoxifen with tamoxifen plus chemotherapy. The strongest evidence appeared to be presented by Paik, Tang and Shak et al.(10). The OncotypeDX recurrence score was found to be correlated with chemotherapy benefit, defined in terms of 10-year DRFS, with a significantly increased benefit from the use of chemotherapy in the OncotypeDX high-risk group compared with the lowrisk group, in ER+, LN- breast cancer patients. However, in a multivariate analysis the benefit from chemotherapy was unclear due to large confidence intervals in the low and intermediate RS risk groups. Albain, Barlow and Shak et al.(11) demonstrated that the RS was prognostic for tamoxifen-treated patients with positive nodes and predicts significant benefit of chemotherapy in tumours with a high recurrence score. They concluded that a low score could identify women who might not benefit from anthracycline-based chemotherapy, despite positive nodes. It was also reported by Tang, Shak and Paik et al.(12) that both RS and AoL provided strong independent prognostic information in tamoxifen treated patients, and that RS used alone remained the best predictor of chemotherapy benefit in ER+, LN- breast cancer(13).

Of these four studies reporting evidence that OncotypeDX predicts benefit from chemotherapy, only one, on a LN+ population(11) presented that had not come from the NSABP cohorts. However, there were limitations associated with this study. It had only a moderate sample size, and the time over which tumour samples were collected was not reported, therefore they may be differences in diagnostic criteria

being applied. Two other studies(12,13) reported the same trial data as Paik, Tang and Shak et al.(10) from the NSABP cohorts, introducing biases associated with double counting in the evidence base as a whole. It should further be noted that the Paik, Tang and Shak et al.(10) study may also have been subject to bias, as some patients in the validation dataset were also in the training dataset which may partly explain the treatment interaction seen with OncotypeDX.

Mammostrat

No prospective studies of the impact of Mammostrat on long-term outcomes such as overall survival were identified. Initial evidence for the predictive ability of Mammostrat from one study(14) suggests that low and high-risk groups benefited from chemotherapy, with high-risk patients benefiting more than low- risk. The intermediate-risk group did not appear to benefit.

Changes in treatment recommendations as a result of testing

OncotypeDX

Twenty-eight studies (see table 3) provided evidence on the impact of OncotypeDX on clinical decision-making. These studies indicated that the use of OncotypeDX leads to changes in treatment recommendations for between 21% and 74% of all patients who underwent OncotypeDX testing. Three studies (17,24,25) did not report whether changes led to increased or decreased use of chemotherapy. However, where this was reported the number of patients being recommended chemotherapy after the test was introduced declined in most studies. This change from chemotherapy to no chemotherapy ranged from 6% to 51.4% of all patients tested. However, in one study more chemotherapy was used after the introduction

of OncotypeDX(28). It was not clear in a large number of the studies whether these figures represented actual changes in the treatments patients received.

MammaPrint

Six studies were identified which provided evidence on changes in treatment recommendations as a result of MammaPrint (see table 3). These studies indicated that the use of MammaPrint in addition to clinicopathological factors led to changes in treatment recommendations for between 18% and 40% of all patients tested, and that the between 2% and 32% of all patients would be recommended to change from chemotherapy to no chemotherapy. One of these studies(45) reported the use of MammaPrint compared to AoL would result in altered treatment advice for 40% of patients. However, this was based on the assumption that all patients classified as high-risk would receive chemotherapy and patients classified as low risk would not receive chemotherapy. Again, in a number of these studies it is not clear if actual treatment changes occurred following introduction of the test.

A prospective observational study(43) showed that adjuvant treatment was recommended for 48% of patients based on, and Dutch Institute for Healthcare Improvement (CBO) guidelines (2004) alone, increasing to 62% when MammaPrint was added. This increased the number of patients receiving adjuvant systemic therapy by 20 (5%). For the other guidelines assessed (St Gallen guidelines, the NPI and AoL), less adjuvant chemotherapy would be given when the data was based on prognostic signature alone are used. A 5 year follow up study (44) showed that 15% of the MammaPrint low risk patients received adjuvant chemotherapy versus 81% of the high-risk patients. The 5 year distant recurrence free interval (DRFI) probabilities for MammaPrint low-risk patients were 97%, and 91.7% for the high-risk

patients. Actual treatment decisions were based on restrictive CBO guidelines, and doctors and patients preferences limiting the generalisability of these findings.

IHC4

Evidence from one prospective study (50) demonstrated that the IHC4 test led to changes in treatment recommendations for 34% of the patients, with 25% recommended to switch from chemotherapy to no chemotherapy. As there is only one study available and it has a small sample size (n=124), it is difficult to make generalisations based on this evidence. Again, it is not clear whether actual treatment given was changed.

Discussion

OncotypeDX currently has the largest body of evidence on clinical utility relative to the other three tests included in this review. Although, no prospective studies reporting the impact of OncotypeDX on long term outcomes, such as overall survival, yet exist. The Paik, Tang and Shak et al.(10) study represented the most robust evidence of clinical utility. The study showed a decreased relative benefit of chemotherapy in the lower-risk groups. However, the specific cancers in the low-risk groups were less likely to respond to chemotherapy, independent of actual survival probability. Other specific limitations include that fact that in one study (32), compared to the study regimens, more effective chemotherapy regimens are currently being used, and more than 44% of patients were aged below 50 years old, limiting the generalisability of the findings.

The evidence base for MammaPrint, is primarily based on small sample sizes (n<427). Some studies were retrospective in design and had heterogeneous patient populations. Some studies included only pre-menopausal women, which may overestimate the benefit of MammaPrint in the early breast cancer population as a whole, given that younger women are likely to be at higher risk of recurrence and are more likely to be classified as poor prognosis using MammaPrint. Further evidence is required to clarify whether using the test will improve the use of adjuvant chemotherapy in the management of breast cancer. It is also unclear to what extent MammaPrint risk groups are predictive of chemotherapy benefit or how the use of MammaPrint will improve patient outcomes through increases in disease-free and overall survival.

One study on Mammostrat(14) provides evidence relating to the benefit of chemotherapy by risk group. However, this indicates that both low and high-risk groups benefit, whilst it is unclear how those in the moderate risk group would be affected. Further evidence is required. In particular there was no published evidence on the impact of the test on decision-making.

One clinical utility study was available for IHC4(50). This study provided evidence on the impact of the test on decision-making leading to reductions in the amount of chemotherapy recommended. Although the design was prospective it included a relatively small sample of patients.

Limitations

The varied nature of the evidence base makes comparisons between tests difficult.

A characteristic feature of the studies across all tests was their heterogeneity, and a large proportion of the studies were small. Many studies used old archived tumour

samples, and some, retrospective chart review to elicit treatment recommendations before and after testing. There was a lack of standardised decision-making tools both within and between studies and non-standardised methods of patient selection were used. Furthermore, a number of the studies for OncotypeDX and MammaPrint were funded by the manufacturer giving rise to potential issues of conflict of interests and publication bias.

Conclusion and Implications

One of the tests (OncotypeDX) has a reasonably large evidence base, although there are some methodological weaknesses relating to this evidence, in terms of heterogeneity of patient cohorts, and retrospective study design. The previous systematic reviews(7,8) on which our updates were based reported that OncotypeDX was furthest along the validation pathway, and that recurrence score was significantly correlated with disease-free-survival and overall survival. There was also some evidence that there may be a significant benefit from the use of chemotherapy in the OncotypeDX high-risk group, although it was acknowledged that this study may have been subject to bias. Our previous review (3) and this update demonstrates that further larger studies have now reported, which support the prognostic capability of the OncotypeDX test, and in the evidence base has been extended to include the LN+ population. Also, further studies have presented evidence on the impact of OncotypeDX on clinical decision-making. The previous reviews(7,8) indicated that evidence relating to the clinical validity of MammaPrint was not always conclusive or supportive of the prognostic value of the test, and one study was identified which suggested that MammaPrint had an impact on clinical decision-making. Our previous review (3), together with this update identified studies which showed the MammaPrint score is a strong independent prognostic

factor and may provide additional value to standard clinicopathological measures, although the populations in all of these studies were relatively small. Further studies on the clinical utility of MammaPrint reported on test reclassification against currently used guidelines, reporting that treatment advice for a percentage of patients may change. However, none of the studies provided evidence of actual changes in treatment decisions following introduction of the test.

This update has demonstrated that in comparison to our original review(3) a number of new studies have emerged which assess the effect of the tests on clinical decision making. However, most of these studies are small scale and it remains the case that further robust evidence on the clinical utility of all of these tests is needed. This would include studies investigating predictive ability, and prospective studies investigating how the tests will be used in clinical practice. Two ongoing trials relating to OncotypeDX(51) and MammaPrint(52) have been designed to address some of these issues, specifically relating to the effect of these tests on patient outcomes and their ability to predict treatment response. The TAILORx trial(51) demonstrate that endocrine treatment alone is non-inferior to aims to chemoendocrine treatment in women with an intermediate OncotypeDX score. Patients allocated to an intermediate risk group using the recurrence score will receive endocrine therapy and be randomly assigned to chemotherapy or no chemotherapy. The MINDACT trial(52) aims to assess the value of MammaPrint in predicting which patients would benefit from chemotherapy compared with Adjuvant! Online. Patients assessed as high risk by one method and low risk by the other will then be randomised to follow the treatment indicated by MammaPrint or the treatment indicated by Adjuvant! Online. Two further objectives of the trial relating to the efficacy of different chemotherapy agents and endocrine treatment strategies are

addressed by two further stages of randomisation. These trials will result in direct evidence that these tests in breast cancer patients lead to improvement in outcomes with the use of RCTs comparing the outcomes of patients following standard management to those of patients managed with the aid of the expression-based assays. All tests would benefit from further evidence demonstrating how they will be used in the current decision-making process and, especially, how this will impact on patient management decisions.

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Table 1: Summary of evaluated gene expression profiling and expanded immunohistochemistry tests.

	OncotypeDX	MammaPrint	IHC4	Mammostrat
Function	Risk of recurrence	Risk of recurrence	Risk of recurrence	Subtyping and Risk of recurrence
Technology	Reverse transcription polymerase chain reaction	Microarray	Combining 4 IHC tests & clinical parameters to derive prognostic score	Uses 5 biomarkers to derive risk score
	(21 gene)	(70 gene)		
Location of testing	Central	Central Irvine, USA	Local (but quality assurance issues need to be addressed)	Central
Type of sample	Formulin fixed paraffin embedded	Fresh (Use of Formulin fixed paraffin embedded has now been introduced)	Formulin fixed paraffin embedded	Formulin fixed paraffin embedded
Population	ER +, LN-, LN 1-3	ER+ (or ER-), LN-, LN 1-3, tumour size <5cm	Post menopausal. ER+, LN-	ER+, LN-, LN 1-3
Presentation of results	RS and risk group (Low <18, Intermediate 18- 30, high>=31)	2 categories – low and high risk	IHC4 risk score	Risk groups - (High. >0.7, Moderate, ≤0.7, Low, ≤0.)
Cost	GBP 2,580 (EUR 3263)	GBP 2,675 (EUR 3387)	Approx GBP 100- 200 (EUR 126-253)	Approx GBP 1120-1620 (EUR 1417-2049)

RS = recurrence score, ROR = risk of recurrence score, ER+ = oestrogen receptor positive, ER- = oestrogen receptor negative, LN- = lymph node negative, LN 1-3 = 1-3 lymph nodes involved, IHC = lmmunohistochemistry.

Table 2: Summary of patient characteristics, study characteristics, and key findings relating to the prediction of treatment effect with adjuvant chemotherapy

Autho	Design	Populatio n	Treatment	Outc	Treatment outcomes and Key Findings
(year)				meas ure	
Oncotyp	eDX				
Paik, et al. (2006) (10)	Prospectiv e- retrospecti ve study in using existing trial data (NSABP B- 20).	ER+, LN-, HER2+/- N=651/222 9 (28.9%)	HT: tamoxifen (n=227) CHT: tamoxifen + CMF/MF (N=424).	10- year DRF S	Low RS: CHT = 4.4% / HT =3.2%; RR = 1.3 (0.46-3.78) Intermediate RS: CHT = 10.9%/HT = 9.1%; RR=0.61 (0.24-1.59) High RS:CHT = 11.9%/HT = 39.5%; RR = 0.26 (0.13-0.53) RS was correlated with chemotherapy benefit, (10-year DRFS). Significate benefit of chemotherapy in the high RS group (p = 0.001).
Albain, et al. (2010) (11)	Prospectiv e- retrospecti ve study from the SWOG- 8814 trial.	ER+ and/or PR+, LN+ (postmeno pausal) N=367/927 (39.6%)	HT: tamoxifen (N=148) CHT: CAF >tamoxifen (N=219)	10- year DFS	Low RS: HR=1.02 (0.54-1.93) Intermediate RS: HR:0.72 (0.39-1.31) High RS: HR = 0.59 (0.35-1.01) Low RS: HR=1.18 (0.55-2.54) Intermediate RS: HR:0.84 (0.40-1.78) High RS: HR = 0.56 (0.31-1.02) RS is prognostic for tamoxifen-treated patients with positive nodes and predicts significant benefit of CHT in tumours with a high recurrence score.
Tang, et al. (2011) (12)	Prospectiv e- retrospecti ve study from the NSABP- B14 and B20 trial.	ER+, LN- N=651 (B20 cohort)	HT: tamoxifen CHT: tamoxifen + chemotherap y	OS DFS	P=0.031 for RS x treatment interaction P=0.011 for RS x treatment interaction P=0.082 for RS x treatment interaction RS was significantly predictive of chemotherapy benefit. (for DRFI, for OS, and DFS), but for AoL was not. In the larger B-20 sub-cohort, AoL was significantly predictive of chemotherapy benefit for OS but not for DRFI or DFS.
Tang, et al. (2010) (Abstr act only)(1 3)	Prospectiv e- retrospecti ve study from the NSABP B- 20 trial.	ER+, LN- N=625	HT: tamoxifen CHT: NR	DR	HR=0.84 (P=0.037 for RS x treatment interaction). RS used alone remains the best predictor of chemotherapy benefit in ER+, N- breast cancer.
Ross,	Prospectiv	ER+, LN-	HT:	DRFI	Low risk: improved by 5% from 86% to 91%, HR 0.4 (95%CI:

Autho r (year)	Design	Populatio n	Treatment	Outc ome meas ure	Treatment outcomes and Key Findings
et al. (2008) (14)	e- retrospecti ve study from the NSABP B14 and B20 trials	N=711	tamoxifen		0.2 – 0.8), High risk: improved by 21% from 64% to 85%, HR 0.4 (95%CI: 0.2 – 0.9), Showing that these groups benefited from chemotherapy, whereas the patients in the intermediate risk group did not.

RS = recurrence score, RR = Relative risk, HR = Hazard ratio, AoL = Adjuvant! Online, ER+ = oestrogen receptor positive, ER- = oestrogen receptor negative, LN- = lymph node negative, LN 1-3 = 1-3 lymph nodes involved, HT = hormone therapy, CHT = chemotherapy, CMF/MF, CAF = specific chemotherapy regimen, DRFS = Distant recurrence free survival, DRFI = Distant recurrence free interval, DFS = disease free survival, OS = Overall survival.

Table 3: Summary of patient characteristics, study characteristics, and key findings relating to changes in treatment recommendations

Autho r (year)	Design	Population	Prior treatment recommendation	Results				
	OncotypeDX							
Oratz, et al., (2007) (15)	Retrosp ective study	N=74	Clinician treatment recommendation before and after GEP testing	RS led to change in clinicians' treatment recommendations in 21% of patients, and in actual administered treatment in 25% of patients.				
Asad, et al. (2008) (16)	Retrosp ective chart review.	ER+, LN- Mean age: 54 years N=85	CHT for high risk based on international guidelines; and HT for low risk.	RS led to changes in the decision for chemotherapy in 37 (44%) of patients; 34% reduction in CHT recommendations.				
Rayha nabad, et al. (2008) (17)	Retrosp ective chart review.	ER+, LN- Mean age: 54 years (range:26-78) N=58	CHT for high risk based on international guidelines; and HT for low risk.	RS led to change in management for 15 (26%) patients.				
Geffen , et al. (2009) (18)	Prospec tive study.	LN- N=25	Not reported	RS led to a change in treatment recommendation for nine patients (36%). Six (24%) from chemotherapy to no chemotherapy.				
Henry, et al. (2009) (19)	Retrosp ective study.	ER+, LN- N=29	Medical oncologist opinion; clinical data, AoL risk estimates followed by RS.	RS led to a change in CHT decisions in 9/29 (31%) patients, seven (24%) from CHT to no CHT and two (7%) from no CHT to CHT with low RS.				
Klang, et al. (2010) (20)	Retrosp ective study	N=313	Clinician treatment recommendation before and after GEP testing.	RS led to change in treatment recommendations in 40% of patients; 27% reduction in CHT recommendations.				
Lo, et al. (2010)	Prospec tive multicen	ER+, LN- Mean age: 55 years	Clinician treatment recommendation before and after	RS led to changes in clinician treatment recommendations for 28 patients (31.5%). 20 (22%)of these were from CHT to HT. Twenty-four patients (27%) changed their own				

Autho r (year)	Design	Population	Prior treatment recommendation	Results
(21)	tre study	(range 35-77) N=89	GEP testing.	treatment decision, 9 from CHT to HT, 7 from HT to CHT, 2 from undecided to HT, and 2 from undecided to CHT.
Adem uyiwa, et al. (2011) (22)	Retrosp ective, consecu tive series.	ER+,LN-, HER2- Mean age: 54.8 years (range:29-82) N=276	CHT recommendations based on clinicopathological characteristics	RS led to change in treatment for 38% of patients with 37 (13%) fewer patients receiving CHT.
Geffen , et al. (2011) (23)	Retrosp ective study	ER+ (N=134), LN- /LN1 Median age, 58 range (33–75) N=135	Treatment recommendations based on AoL.	RS led to a change in treatment recommendation for 34 (25.2%) patients. This change was from CHT to no CHT for 24 (17.8%) patients and from no CHT to CHT for 10 (7.4%).
Joh, et al. (2011) (24)	Retrosp ective study	ER+ N=154	Clinician panel	RS led to a 25% change in treatment recommendations.
Partin & Mamo unas (2011) (25)	Retrosp ective study	ER+, LN- N=169	Treatment recommendations based on AoL and St.Gallen	RS led to change in treatment recommendation in 27-74% of patients depending on comparator guideline.
Albane II, et al. (2012) (26)	Prospec tive study	ER+, LN-, HER2- Mean age: NR, <50 yrs (n=40), ≥50 yrs (n=67) N=107	Treatment recommendation based on traditional clinicopathological factors.	RS led to changes in treatment recommendations in 32% of 107 patients enrolled: in 21% from CHT to HT and in 11% from HT to CHT.
Bargall o, et al. (2012) (27)	Prospec tive study	ER+, HER2-, LN-/LN1-3 Mean age: NR (range 32-89 years) N=96	Treatment recommendation based on conventional clinical— pathological factors and patient input.	RS led to changes in treatment decisions for 31/96 (32%) patients, including 17/62 (27%) LN- patients and 14/34 (41%) LN+ patients. The proportion of patients with a CHT recommendation decreased from 48% pre- to 34% post-assay.
Birosc hak, et al. (2013) (28)	Retrosp ective study	ER+, LN- Mean age: 60.2 (range 39 to 78) N=50	Treatment was recommended based on histologic assessment.	RS led to changes in treatment decisions in 36 and 18% of cases by breast surgeons and medical oncologists, respectively. Breast surgeons increased recommendations for CHT in 15 (30%) of cases and decreased to no CHT in 3 (6%) of cases; and the medical oncologist increased to CHT in 4 (8%) of cases and decreased to no CHT in 5 (10%) of cases.
Davids on, et	Prospec tive	ER+, HER2-, LN- Mean age: 53	Treatment recommendation based on clinician	RS led to changes in CHT recommendations in 45/150 cases (30%) either to add (10%) or omit (20%) CHT.

Autho r (year)	Design	Population	Prior treatment recommendation	Results
al. (2013) (29)	study	(range 23-78 years) N=150	and patient pre- assay questionnaires.	
De Boer, et al. (2013) (30)	Prospec tive study	ER+, HER2-, LN- /LN1-3 Mean age: 56.2 N=151	Treatment recommendation base on routine pathology.	RS led to treatment recommendation changes for 24/101 patients with LN- tumours (24%) and for 13/50 patients with LN+ tumours (26%). For patients with LN- tumours there was a change from CHT to HT for 23%, and for 25% of patients with LN+ tumours.
Eierm ann, et al. (2013) (31)	Prospec tive study.	ER+, HER2-, LN-/LN1 Mean age: 56 N=366	Treatment was recommended based on available clinical and histopathological data.	Treatment recommendations changed in 33% of patients. In 25% of patients CHT was changed to no CHT.
Holt, et al. (2013) (32)	Prospec tive cohort	ER+, LN-/LN1 N=106	Treatment recommendation base on NPI.	35 patients (33%) had their initial recommendation changed as a result of RS whilst for 71 patients (67%) there was no change. 25 (23.5%) changed from CHT to no CHT.
Cheun g, et al. (2014) (33)	Retrosp ective study	ER+, HER2-, LN-/LN1 Mean age: 48 (range 24-67 years) N=154	Treatment recommendation based on clinical factors and AoL.	RS led to a change in treatment recommendations for 20 (31%) patients. 16 (10%) of these were changes to lower-intensity regimens (either equipoise or HT).
Fried, et al. (2014) (34)	Retrosp ective study.	ER+, LN-/+ (All intermediate RS) N=111	Clinician treatment recommendation before and after GEP testing.	RS led to a change in treatment recommendations for 24 patients (21.6%). Of 78 patients recommended HT alone, 11 changed to CHT (14.1%); of 33 recommended CHT, 13 received HT alone (39.4%).
Jaafar, et al. (2014) (35)	Retrosp ective study	ER+, LN- N=47	Treatment recommendation based on clinical factors.	RS led to a treatment change for 13 patients (27.7%), and CHT use decreased overall, from 48.9 to 25.5%.
Yama uchi, et al. (2014) (36)	Prospec tive study.	ER+, LN-/LN1-3, HER2- N=124	Treatment recommendations based on local and international guidelines.	RS led to a change in treatment recommendations in 33% of node-negative (N0) and 65% of node-positive (ND) patients. In 27of 48 (56%) of N0 and 13 of 15 (87%) of N+ patients an initial recommendation for CHT was revised to HT after RS, and in 7 of 56 (13%) of N0 and 0 of 5 N+ patients from HT to CHT.
Gligor ov, et al. (2015) (37)	Prospec tive study	ER+, LN-/LN1, HER2- N=95	Treatment recommendation based on clinical factors.	RS led to changes in treatment recommendations in 37% of patients, predominantly from CHT to HT alone. Patients recommended CHT decreased from 52% to 25% post RS.
Lee, et al.	Retrosp ective chart	ER+, LN-/LN1	Treatment was recommended using institutions'	RS led to a change in treatment decisions in 115 of 212 patients (54.2%), in 109 (51.4%) from CHT to HT, and in 6

Autho r (year)	Design	Population	Prior treatment recommendation	Results
(2015) (38)	review.	N=212	guidelines, based on clinicopathologic characteristics.	(2.8%) from HT to CHT.
Zhang, et al. (2015) (39)	Prospec tive study.	ER+, LN- N=134	Treatment recommendations based standard clinicopathologic criteria according to on St. Gallen and AoL.	RS led to a change in treatment decisions for 29% of patients, with 6% (8/134) changing to receive CHT and 23% (31/134) changing to reject CHT.
Kuchel , et al. (2016) (40)	Prospec tive study	ER+, HER2-, LN- /LN1-3 N=135	Clinician and patient recommendation before and after GEP testing.	RS led to changes in clinician treatment recommendations in 40.7% of patients. Of 69 patients with a pre-testing CHT recommendation, 43 (62.3%) had a recommendation change to HT only. Of the 66 patients with a pre-testing HT recommendation, 12 (18.2%) had a recommendation change to CHT. These changes led to a net reduction in the oncologists' CHT recommendation rate from 50.4 to 27.7%. RS also led to 41 patients (31.3%) changing their treatment choice. Of the 52 patients with an initial CHT choice, 28 patients (53.8%) changed their choice to HT only. Of the 79 patients with an initial HT choice, 13 (16.5%) changed their choice to CHT. These changes led to a net reduction in CHT use from 39.7 to 28.2%.
Levine , et al. (2016) (41)	Prospec tive study.	ER+, LN-, HER2- N=979	Treatment recommendations based on AoL.	RS led to a change from unsure or CHT to no CHT in 365 (38%), and changed from unsure or no CHT to CHT in 143 (15%). CHT was recommended for 236 patients, 81% of whom received CHT.
Ozme n, et al. (2016) (42)	Prospec tive study.	ER+, LN-/LN1, HER2- N=165	Treatment was recommended based on histologic assessment.	RS led to a change in treatment decision for 33% of patients. Pre RS CHT was recommended to 92 (56%) of all patients, which decreased to 61 (37%) patients post-RS.
Mamma	l Print			
Bueno -de- Mesqu ita, et al. (2007) (43); Drukk er, et al. (2013) (44)	Prospec tive multicen tre study.	ER+/-, LN-/+ Mean age: 48 N=427	Treatment recommendations based on the Dutch Institute for Healthcare Improvement (CBO) guidelines.	Guidelines in addition to the prognosis signature and patient preferences led to an actual change in treatment for 19% of patients. 2% more CHT, 5% more HT, and 6% more CHT+HT. At follow-up 124 patients were categorized as "low-risk" by the 70-gene signature, but high-risk by other measures, such as age, tumor size, nodal status, and other clinicopathological factors. Of these, 76% did not receive chemotherapy, and 98% survived 5 years with no recurrence of disease.
Geven sleben	Consec utive	ER+/-, LN-/+ N=136	Not reported.	GEP testing showed 40% of patients with either over (45%) - or undertreated (32%).

Autho r (year)	Design	Population	Prior treatment recommendation	Results
, et al.	cohort			
(2010)				
(45)				
Hartm	Prospec	ER+, LN-/LN1,	Treatment	The prognosis signature used in combination with the
ann, et	tive	HER2-	according to	clinico-pathological factors, would have led to changes in
al.	study.	Mean age: 70.3.	national guidelines.	18% of patients. Recommendations for CHT for 6 additional patients (10%) and withheld in 5 patients (8%).
(2012)		N=60		
(46)		N=00		
Cusu	Prospec	ER+/-, LN-/LN1-3,	Treatment	MammaPrint led to changes in treatment advice for 37% of
mano,	tive	HER2+/-	recommendation based on	patients by the Dutch (14% decrease in CHT), 24% by the Belgian (0% decrease in CHT), 28% by the Italian (13%
et al	study.	N=194	clinicopathological	increase in CHT) and 35% by the Spanish teams (2%
(2014)			factors.	decrease in CHT).
(47)				MammaPrint increased the inter-institutional agreement in treatment advice (CHT or no CHT) from 51% to 75%.
Drukk	Retrosp	N=37	Treatment	MammaPrint led to changes in treatment advice in 24% of
er, et	ective	(other factors not	recommendation based on	cases. Pre MammaPrint recommended treatments were CHT in 48%, and HT in 46% of the cases. After adding
al.	case review	reported)	clinicopathological	MammaPrint recommended treatments were CHT 37%, and
(2014)	1001000		factors.	HT in 57% of cases.
(48)				Adding MammaPrint resulted in 14.3% of the cases in a change from CHT to HT or no treatment. In 2.1% of the cases the advice of no treatment or HT was changed to CHT. This resulted in a reduction in CHT use of 12.2%.
Exner,	Prospec	ER+, LN-/LN1-3, HER-	Treatment according to	MammaPrint led to changes in treatment advice in 18.6% of cases. In 10 patients (13.3%), there was a decision change
et al.	tive study.	HLN-	according to clinicopathological	towards HT and in 4 patients (5.33%) towards CHT.
(2014)	,	N=75	factors and St Gallen guidelines.	
(49)			Canon galaennes.	
IHC4	_	ED. INI/INI	Totalous	HIOA lad to show the form to the first to th
Yeo,	Prospec tive	ER+, LN-/LN1, HER2-	Treatment recommendation	IHC4 led to changes in treatment advice for 42 patients (34%). Prior to the IHC4 score becoming available clinicians
et al.	study	Madianas 50	based on	recommended CHT (or at least its discussion) to 74 (59%)
(2015)		Median age: 59	clinicpathological factors.	patients, this fell to 32 (34%) after the IHC4 score.
(50)		N=124		

RS = recurrence score, AoL = Adjuvant! Online, NPI = Nottingham Prognostic Index, ER+ = oestrogen receptor positive, ER- = oestrogen receptor negative, LN- = lymph node negative, LN 1-3 = 1-3 lymph nodes involved, HT = hormone therapy, CHT = chemotherapy.

Figure 1: PRISMA Diagram

