Is my patient suffering clinically significant emotional distress? Demonstration of a probabilities approach to evaluating algorithms for screening for distress

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Abstract

Goals of work Screening oncology patients for clinically significant emotional distress is a recommended standard of care in psycho-oncology. However, principles regarding the interpretation of screening and diagnostic tests developed in other areas of medicine have not been widely applied in psycho-oncology. This paper explores the application of the concepts of likelihood ratios and post-test probabilities to the interpretation of psychological screening instruments and demonstrates the development of an algorithm for screening for emotional distress and common psychopathology.

Materials and methods Three hundred forty oncology/haematology outpatients at the Calvary Mater Newcastle, Australia completed the Distress Thermometer (DT), the PSYCH-6 subscale of the Somatic and Psychological Health Report and the Kessler-10 scale. The Hospital Anxiety and Depression Scale (HADS) (cutoff 15+) was used as the gold standard.

Main results Likelihood ratios showed that a score over threshold on the DT was 2.77 times more likely in patients who were cases on the HADS. These patients had a 53% post-test probability of being cases on the HADS compared with the pretest probability of 29%. Adding either the PSYCH-6 (3+) or the Kessler-10 (22+) to the DT (4+) significantly increased this post-test probability to 94% and 92%, respectively. The significance of these improvements was confirmed by logistic regression analysis.

Conclusions This study demonstrated the application of probability statistics to develop an algorithm for screening for distress in oncology patients. In our sample, a two-stage screening algorithm improved appreciably on the performance of the DT alone to identify distressed patients. Sequential administration of a very brief instrument followed by selective use of a longer inventory may save time and increase acceptability.

Keywords Cancer · Oncology · Screening · Emotional distress · Depression · Anxiety

Introduction

Distress in oncology patients has been defined in different ways. Generalised distress has been defined as “...an unpleasant emotional experience of a psychological...social and/or spiritual nature that may interfere with the ability to cope effectively with cancer, its physical symptoms and its treatment” [1], whilst emotional distress refers more specifically to anxiety, depression and adjustment disorders related to experience of cancer [2].

Emotional distress is common in oncology patients, and its negative consequences are well documented [3]. However, emotional distress frequently goes unrecognised...
and untreated [4]. A formalised programme of screening has been recommended to improve detection and subsequent management of distress [4]. A variety of approaches to screening have been trialled [see for example 5–7]; however, the optimum method has not been established.

Screening needs to be achieved using the minimum number of items to improve acceptability to patients and clinicians [8] whilst providing accurate results, which are meaningful to both parties. A recent review of the psycho-oncology literature on ultra-short (fewer than five items) scales to detect psychiatric conditions recommended a two-step approach to screening [9]. This review proposed that an ultra-short scale be used to rule out a psychiatric diagnosis and recommended a second step in patients who screened positive (over threshold) on the ultra-short scale.

A two step approach was used by Cull et al. [6] to detect oncology patients with clinically significant levels of emotional distress. They recommended initial screening with the five-item Mental Health Inventory (MHI-5) followed by the 14-item Hospital Anxiety and Depression Scale (HADS) for those patients who scored 11 or more on the MHI-5. Cull et al. constructed a decision tree to summarise their screening algorithm. Adding the HADS to the MHI increased the proportion of patients likely to be clinically significant cases on the Present State Exam from 0.35 to 0.47. Fann et al. [10] have implemented a two-stage approach to screening for depression in cancer patients using the Patient Health Questionnaire-9 (PHQ-9), in which patients who respond positively to either of two ‘cardinal’ questions (anhedonia or depressed mood) go on to complete the full nine items, whilst patients who answer no to both items receive no further questions. Fann et al. [10] did not use statistical modelling to describe their algorithm.

Most approaches to validating instruments for distress screening in the psycho-oncology literature report sensitivity (SE) [the proportion of patients classified as ill by the tool that is truly ill according to a gold standard (the true positives)] and specificity (SP) [the proportion of patients that is classified as well by the test who truly are well according to a gold standard (the true negatives)] [11]. However, SE and SP have some limitations in clinical application, since they are population measures, that is “they summarise the characteristics of the test over a population” ([12], p. 111) rather than guide the interpretation of results for individual patients.

Two measures that are more clinically useful for the care of individual patients and that may be more readily interpreted by clinicians and understood by patients are the likelihood ratio and post-test probabilities. The likelihood ratio combines SE and SP to estimate a patient’s likelihood of having disease given a test result, which is positive (positive likelihood ratio) or negative (negative likelihood ratio) [12]. For example, a positive result on a test with a positive likelihood ratio of five indicates that the likelihood of disease is increased by a factor of 5. A negative result on a test with a negative likelihood ratio of 0.1 indicates the likelihood of disease is decreased by a factor of 10. Tests with a likelihood ratio positive of greater than 10 or a likelihood ratio negative of less than 0.1 are considered highly useful in deciding whether a patient has a given condition [13].

The likelihood ratio can be converted to a probability of disease, which is easily interpreted by both patients and clinicians [14]. The probability of disease following a positive test is termed the post-test probability positive, and the probability of disease following a negative test is termed the post-test probability negative. For example, a positive result on a test with a post-test probability positive of 77% would indicate a 77% probability of having emotional distress. A negative result on a test with a post-test probability negative of 2% would indicate a 2% probability having emotional distress according to a gold standard.

Calculating the post-test probability has been described by Jaeschke et al. [13] as “not too difficult...but tedious and off-putting” (p. 354). It involves “converting pretest probability to odds, multiplying the result by the likelihood ratio and converting the consequent posttest odds into a post-test probability” ([13], p. 354). An alternative method to estimate post-test probability, which is suitable for use in clinical practice, is to use a nomogram [15].

To use the nomogram requires estimation of the pre-test probability and calculation of the likelihood ratio. Pre-test probability is the probability that a patient has a disease, without reference to any tests. This will usually be the prevalence of the disorder in a given population. For example, if the prevalence of distress in a population of outpatients with mixed cancer types is 25%, then a clinician could reasonably estimate that an individual patient had a 25% probability of distress, that is, the pretest probability of distress is 25%. Pre-test probability usually must be informally estimated by the clinician [12].

Another advantage of post-test probabilities is that they can be used to integrate the results of multiple tests. To combine the results of two tests, the post-test probability following the first test becomes the pre-test probability for the second test. It is important to note that combining the results of multiple tests in this way requires that the tests be independent [16]. Tests are independent if a patient is no more likely to get a positive result on one test given a positive result on the other [16]. In practice clinical tests are rarely independent [17]. Psychological tests in particular are likely to be highly correlated. Although the combination of tests can be powerful [17], violation of this assumption can result in a less accurate estimate of post-test probability.
than using the best single indicator [16]. Multiple logistic regression analysis should be used to examine whether integrating the results of more than one test leads to improved accuracy despite lack of independence between tests [18].

Aim

The aim of this paper was to explore the use of likelihood ratios and post-test probabilities in the detection of emotional distress amongst oncology outpatients. The statistical methods described in this paper are well established (see for example [19–21]); however, we are not aware of any other paper that has applied this method in detecting cases of emotional distress amongst oncology outpatients.

The specific aims of the study were to
1. Apply the concepts of likelihood ratios and post-test probabilities to the evaluation of individual tests for emotional distress
2. Demonstrate the use of post-test probabilities to evaluate the performance of a two-stage (sequential) scoring algorithm to screen for emotional distress
3. Explore the effect of varying the thresholds for defining cases on the performance of a sequential screening algorithm

Materials and methods

Setting

The study was conducted at the Calvary Mater Newcastle hospital, NSW, Australia during an 8-week period (April–May 2005). This hospital provides comprehensive secondary and tertiary treatment services for adults with malignant disease in Medical Oncology, Surgical Oncology, Radiation Oncology and Haematology. The project was approved by the Hunter Area Health Service Human Research Ethics Committee (protocol number 02/12/11/3.25).

Sample

All patients attending non-surgical Oncology and Haematology outpatient clinics were eligible for the study with the exclusion of patients attending for the first time.

Measures

Hospital Anxiety and Depression Scale The HADS was chosen as the comparator, since it is widely used in oncology [6, 9] and considerable validation work has been undertaken [22, 23]. The HADS is a 14-item scale composed of two subscales containing seven questions on non-somatic anxiety symptoms and seven questions on non-somatic symptoms of depression over the past week [24]. Each item is scored between 0 and 3, with a maximum possible total score of 42 and a minimum of 0. A number of cut-off points have been proposed for the HADS [22]. For this study, a person with a total score of 15 or more (15+) on the HADS was considered a case of clinically significant emotional distress [25]. This cut-off point was found to have SE of 80% and SP of 76% for a diagnosis of either generalised anxiety disorder or major depressive illness using a structured clinical interview (the Psychiatric Assessment Schedule) in a sample of over 500 English cancer patients [25].

Distress Thermometer The Distress Thermometer (DT) has been widely evaluated for use in oncology populations [3]. It is a single- item visual analogue scale on which patients indicate the level of distress they have been feeling over the past week from a minimum of 0 to a maximum of 10 [1]. The recommended cut off point on the DT for clinically significant emotional distress is a score of 4 or more [1]. A multi-centre evaluation with 380 patients [5] found that at this cut-off point, the DT had SE of 0.77 and SP of 0.68 in detecting cases as defined by the HADS. The DT is available free of charge.

Somatic and Psychological Health Report The Somatic and Psychological Health Report (SPHERE-12) has been validated in a large scale (n=46,515 patients) Australian survey of general practice patients [26]. It is available free of charge. The “PSYCH” is a six-item sub-scale of the SPHERE-12 and measures aspects of anxiety and depression [26]. It is based on the General Health Questionnaire. Each item is scored on a three-point scale between 0 and 2, with a maximum possible score of 12 and a minimum of zero. The cut-off point for PSYCH-6 caseness recommended by the SPHERE-12’s developers is a score of 2 or more (2+). However, we have previously established that a score of 3 or more (3+) on the PSYCH-6 subscale had greater concordance with HADS caseness amongst oncology outpatients at our facility (unpublished data). Thus, we used score of 3 or more (3+) to designate caseness on the PSYCH. The timeframe was “over the past few weeks”.

Kessler-10 The Kessler-10 (K-10) has been widely used in Australia and is the standard measure of psychological distress used in population surveys by the Australian Bureau of Statistics [27]. The K-10 is a ten-item scale, which measures nonspecific psychological distress, first developed by Kessler and Mroczek in 1992–1994 [28]. The items encompass symptoms of anxiety and depression and are scored on a five-point scale from “None of the time” to
“All of the time”. In this study, the minimum score of 10 represented better functioning, and the maximum score of 50 represented poorer functioning. We used the Australian version of the K-10 [27], and the timeframe was the past 4 weeks. A cut-off score of 22 and above (22+) was used to define caseness [28]. The K-10 is available free of charge.

Procedure

Patient recruitment followed a two-step procedure approved by the local ethics committee. Reception staff offered patients a slip of paper containing study information. Patients who indicated an interest in participating met with research staff and were given a written information sheet. Patients were then asked for written consent and completed the measures on a computer. Clinical information was extracted from participants’ medical records with their written consent by a qualified medical practitioner: cancer type, stage and current (at the time of assessment) treatment with chemotherapy, radiotherapy or other therapy (other medications, haematological support and other treatments). Reasons for non-participation could not be formally collected as the Ethics Committee required that we did not approach patients directly until they had indicated a willingness to talk to research staff.

Statistical analysis

SPSS for Windows Version 14 was used to calculate frequencies and the cross-tabulations (2×2 tables) used in the analyses. Pre-test probability was defined as the prevalence of cases of emotional distress as determined by a score of 15 or more (15+) on the HADS, and the HADS was used as the gold standard. The SE and SP of individual tests (DT, PSYCH and K-10) were calculated using the DAG-Stat programme [11] in order to provide comparison with other papers. The likelihood ratio positive, likelihood ratio negative, post-test probability positive and post-test probability negative for the individual tests were calculated using Microsoft Excel spreadsheets devised by KC, AM and Cynthia Millar.

The likelihood ratio of a positive test was calculated by dividing the SE of a test by one minus the SP [29]. The likelihood ratio of a negative test was calculated by dividing one minus the SE by the SP [29]. Formulae given in relevant texts [for example 30] were used for the calculation of post-test probabilities.

Combining test results to develop a scoring algorithm

To explore the benefits of adding each of the tests to the DT, the post-test probability positive and post-test probability negative for each of two combinations of tests were calculated. To model sequential administration of tests, cases were classified as those with positive scores on test 1 (the DT) and test 2. Thus, cases were defined as those who were cases on (1) both the DT and the PSYCH and (2) on both the DT and the K-10. Non-cases were those who scored negative on the DT and those who scored positive on the DT but negative on the second test.

To calculate post-test probability after two tests, the pre-to-post-test formula was used iteratively. For the post-test probability positive, the post-test probability after a positive score on the DT was used as the pre-test probability, and the likelihood ratio positive of the second test (as a single test) was used. To calculate post-test probability negative with the sequential model (that is after a negative DT or a positive DT and negative second test), the post-test probability after a negative score on the DT was used as the pre-test probability, and the LR negative of the second test (as a single test) were used.

To determine whether the models of sequential test administration significantly enhanced performance compared with the DT alone two logistic regressions were performed, each containing the DT alone as well as the sequential variable. The two regressions were (1) the DT alone and the sequential DT and PSYCH-6 variable and (2) the DT alone and the sequential DT and K-10 variable.

Post-test probability positive and post-test probability negative were calculated at a range of cut-off points in order to explore the optimum combination. Since a screening algorithm ideally has a sensitive first step followed by a specific second step, the effect of lowering the threshold on the DT and raising the threshold of the second step measures (PSYCH and K-10) was explored.

Results

Sample characteristics

A total of 1,707 potentially eligible patients attended clinics during the recruitment period of the study. There were 393 eligible participants who consented to commence the interview (23% response rate), and complete data were obtained for 377. Of the 377 with complete data, 340 participants had malignant disease (Table 1), and this paper is restricted to data from these participants.

The sample had a mean age of 60 years (standard deviation 12 years), range 18–88 years. About half (52%, n=177) of the participants were male; most (74%, n=251) were married or living as married and were not working (73%, n=250). Sixty-two percent (n=214) of participants were currently undergoing some kind of treatment: chemotherapy for 36% (n=122); radiotherapy for 24% (n=83) and
24% \((n=83)\) ‘other’ therapy. Patients could be receiving more than one type of therapy. The two main diagnosis groups were breast cancer \(24\% \ (n=80)\) and haematological malignancy \(24\% \ (n=82\); Table 1).

**Caseness at published cut-off points**

Twenty-nine percent of the sample scored as cases on the HADS \((15+)\). Thus, the pre-test probability used in the calculations for individual tests was 29%. Caseness on the other measures was 29% on the DT, 27% on the PSYCH and 26% on the K-10.

**Sensitivity and specificity**

The SE of the tests to HADS caseness ranged from 0.72 for the K-10 to 0.86 for the DT. Conversely, SP ranged from 0.69 for the DT to 0.94 with the PSYCH-6 (Table 2).

**Likelihood ratios**

The likelihood ratio of a positive score on the DT was 2.77, indicating that a positive score on the DT occurred 2.77 times more frequently amongst HADS cases than amongst non-cases. The likelihood ratio of a negative score on the DT was 0.20, indicating that a negative score on the DT occurred 0.20 times as often amongst HADS cases compared with non-cases. The PSYCH-6 and K-10 had high likelihood ratios for positive scores (13.28 and 10.79, respectively). The likelihood ratios for a negative score on the PSYCH-6 and K-10 were slightly higher than for the DT (0.24 and 0.30).

**Post-test probability**

The post-test probability of HADS caseness following a positive score on the DT was 0.53, indicating that a person who scored positive on the DT had a 53% chance of being

<table>
<thead>
<tr>
<th>Performance index</th>
<th>Test</th>
<th>DT cutoff 4+</th>
<th>PSYCH-6 cutoff 3+</th>
<th>K-10 cutoff 22+</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td></td>
<td>Sensitivity (95% CI)</td>
<td>Specificity (95% CI)</td>
<td>Likelihood ratio positive</td>
</tr>
<tr>
<td></td>
<td></td>
<td>0.86 ((0.77–0.92))</td>
<td>0.69 ((0.62–0.75))</td>
<td>2.77</td>
</tr>
<tr>
<td></td>
<td></td>
<td>0.77 ((0.68–0.84))</td>
<td>0.94 ((0.90–0.97))</td>
<td>13.28</td>
</tr>
<tr>
<td></td>
<td></td>
<td>0.72 ((0.62–0.80))</td>
<td>0.93 ((0.89–0.96))</td>
<td>10.79</td>
</tr>
</tbody>
</table>

\(^a\)Using HADS total as gold standard. Twenty-nine percent prevalence of distress equals a pre-test probability of 0.29 and pre-test odds of 2.9:7.1

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**Table 1** Demographic and disease characteristics of sample \((n=340)\)

<table>
<thead>
<tr>
<th>Number of patients</th>
<th>Percent</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Marital status</strong></td>
<td></td>
</tr>
<tr>
<td>Married or de facto</td>
<td>251</td>
</tr>
<tr>
<td>Separated or divorced</td>
<td>39</td>
</tr>
<tr>
<td>Widowed</td>
<td>29</td>
</tr>
<tr>
<td>Never married</td>
<td>21</td>
</tr>
<tr>
<td><strong>Employment status</strong></td>
<td></td>
</tr>
<tr>
<td>Pension</td>
<td>168</td>
</tr>
<tr>
<td>Full-time</td>
<td>58</td>
</tr>
<tr>
<td>Part-time</td>
<td>32</td>
</tr>
<tr>
<td>Sickness benefit</td>
<td>11</td>
</tr>
<tr>
<td>Unemployed</td>
<td>5</td>
</tr>
<tr>
<td>Other</td>
<td>66</td>
</tr>
<tr>
<td><strong>Diagnosis</strong></td>
<td></td>
</tr>
<tr>
<td>Haematological malignancy</td>
<td>82</td>
</tr>
<tr>
<td>Breast</td>
<td>80</td>
</tr>
<tr>
<td>Urological</td>
<td>51</td>
</tr>
<tr>
<td>Colo-rectal</td>
<td>38</td>
</tr>
<tr>
<td>Lung</td>
<td>25</td>
</tr>
<tr>
<td>Other malignancy</td>
<td>64</td>
</tr>
<tr>
<td><strong>Stage</strong></td>
<td></td>
</tr>
<tr>
<td>Haematological</td>
<td></td>
</tr>
<tr>
<td>Advancing disease (palliative)</td>
<td>5</td>
</tr>
<tr>
<td>Active treatment investigations</td>
<td>38</td>
</tr>
<tr>
<td>Stable disease/partial response</td>
<td>19</td>
</tr>
<tr>
<td>Complete remission</td>
<td>18</td>
</tr>
<tr>
<td>Non-haematological</td>
<td></td>
</tr>
<tr>
<td>Metastatic</td>
<td>47</td>
</tr>
<tr>
<td>Locally advanced (palliative)</td>
<td>28</td>
</tr>
<tr>
<td>Limited/local</td>
<td>104</td>
</tr>
<tr>
<td>None</td>
<td>81</td>
</tr>
</tbody>
</table>

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**Table 2** Indices of test performance for individual tests compared with the HADS total score using a cut-off of 15+

\(DT\) Distress thermometer, \(PSYCH-6\) PSYCH-6 subscale of the SPHERE-12, \(K-10\) Kessler-10; \(95\% CI\) 95% confidence interval
a case on the HADS (Table 2). The post-test probability of HADS caseness after a negative score was 0.08, indicating that a person who scored negative on the DT had an 8% chance of being a case on the HADS. The post-test probability of HADS caseness for a positive score was over 80% for the PSYCH-6 and the K-10 (Table 2). The post-test probability of HADS caseness for a negative score was similar for the PSYCH-6 and K-10 (9% and 11%, respectively; Table 2).

Combining test results to develop a screening algorithm

The model of sequential administration, using the DT followed by a second test, resulted in higher post-test probability positive and lower post-test probability negative than obtained with the single-item DT.

Using the formula iteratively, at the cut-off points shown in Table 2, following the DT (4+) by the PSYCH-6 (3+) increased the post-test probability of a positive test to 94% from 53% and decreased the post-test probability of a negative test to 2% from 8%. Similarly, when the DT (4+) was followed by the K-10 (22+), post-test probability positive increased to 92% (from 53%) and post-test probability negative decreased to 2% (from 8%).

Logistic regression analyses confirmed that the model of sequential administration of the DT followed by the PSYCH-6 had significantly improved performance compared with the DT as a single test (change in −2 log likelihood=81.00, df=1, p<.001). Similarly, the model of the DT followed by the K-10 had significantly improved performance compared with the DT as a single test (change in −2 log likelihood=53.03, df=1, p<.001).

Effect of varying the thresholds for defining cases

The effect of lowering the DT and increasing the threshold on the PSYCH-6 and K-10 instruments is shown in Table 3. At the thresholds examined, all combinations of the DT with either the PSYCH-6 or the K-10 performed within 6% of each other. Post-test probability increased from 90% to 95% for the PSYCH-6 at the highest threshold and increased from 88% to 94% for the K-10. Post-test probability negative was never more than 6%.

Discussion

This paper demonstrated the application of likelihood ratios and post-test probabilities to screening for emotional distress in oncology patients and modelled the effect of sequential administration of tests. As single tests, the PSYCH-6 and the K-10 outperformed the DT in terms of likelihood ratios and the post-test probability positive of being a case on the HADS. The three scales had similar post-test probability negative.

Logistic regression analysis confirmed that adding a second measure to the DT improved the detection of HADS caseness, despite the lack of independence between tests. In our sample, patients with positive scores on the DT followed by the PSYCH-6 or the DT followed by the K-10 had greater than 90% probability of HADS caseness. Non-cases had around 2% probability of being HADS cases. The effect of lowering the threshold on the DT and raising the threshold on the PSYCH-6 or K-10 varied performance by up to 6%.

Clinical application

In clinical practice, the sequential administration of tests would be the ideal to minimise the number of items asked and therefore improve acceptability to patients and staff. In devising a screening strategy, a trade off must be made between maximising SE and maximising SP. The optimal choice depends on the context of screening. In terms of screening for distress, it could be argued that maximum SE is required in order to offer patients the best possible care, and in this context, the DT alone might be chosen. However, centres implementing this strategy are likely to require considerable resources. Based on our sample, 29% of patients would require some kind of follow-up, and for close to half of them, this would be misdirected.

Restricting screening to a single item such as the DT would save time for patients and staff, especially if screening is done repeatedly, at successive clinic visits, thereby improving acceptability. For example, if a single item takes 30 s to complete, compared with 3 min for a six-item scale, then for every 1,000 occasions of screening, a one-item scale saves around 40 h. Compared with a 14-item

<table>
<thead>
<tr>
<th>Scale</th>
<th>Cut-off</th>
<th>Distress Thermometer cut-off point</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>2</td>
<td>3</td>
</tr>
<tr>
<td></td>
<td>+ve</td>
<td>−ve</td>
</tr>
<tr>
<td>PSYCH-6</td>
<td>3</td>
<td>90</td>
</tr>
<tr>
<td></td>
<td>4</td>
<td>95</td>
</tr>
<tr>
<td></td>
<td>5</td>
<td>95</td>
</tr>
<tr>
<td>K-10</td>
<td>22</td>
<td>88</td>
</tr>
<tr>
<td></td>
<td>23</td>
<td>89</td>
</tr>
<tr>
<td></td>
<td>24</td>
<td>91</td>
</tr>
</tbody>
</table>

+ ve Post-test probability positive, − ve post-test probability negative

PSYCH-6 PSYCH-6 subscale of the SPHERE-12, K-10 Kessler-10
scale like the HADS, a one-item scale would save staff and patients over 100 h per 1,000 occasions of screening. In our regional hospital, where we screen approximately one third of outpatients using a sequential model (DT and the PSYCH), described in more detail below, we completed over 3,000 occasions of screening in the first 6 months of operation. Based on 71% scoring under threshold on the DT, screening has taken 3 min less time on 2,130 occasions, a saving of over 100 h for patients and staff.

In centres where resources for dealing with emotional distress are limited, a strategy to maximise SP might better suit the circumstances. In this case, the sequential method of screening could be employed. Resources would be closely targeted to clinical cases of depression and anxiety; however, a small percentage of cases would be missed. Using the iterative formula as applied to our sample, patients identified by screening would have a 92–94% probability of being cases, and those not identified by screening would have a 2–3% probability of being cases.

We have implemented the sequential screening algorithm in our clinical service. Patients complete a computerised touchscreen survey whilst waiting for their oncology or haematology outpatient appointment [31]. Patients who score under threshold on the DT complete the associated problem list but do not have a written, scored feedback generated for their treating oncologist or haematologist. Patients who score over threshold on the DT are then given the six items from the PSYCH. A written, scored report is generated for all patients scoring over threshold on the DT and is placed with the notes for the treating oncologist/haematologist to use during the consultation. A recommendation to consider referral to the Psycho-Oncology service is made for patients scoring three or above on the PSYCH-6, and a recommendation to consider referral to social work is made for patients scoring 2 or less on the PSYCH. A recommendation to explore all items checked on the problem list from the DT is also made. Following screening, clinicians are able to further explore patient concerns and apply a tailored approach to intervention, from information provision, which is universally required, to therapy with specialist mental health professionals for the small but important minority of patients with significant mental health problems [32]. Patient acceptance of screening is high, with 87% of approached patients agreeing to undertake screening (unpublished data).

Strengths and limitations of the study

In interpreting the results of this paper, the limitations associated with the use of the HADS as a gold standard for emotional distress must be considered. Although widely used, the HADS, like any relatively brief self-report emotional distress measure, has limitations. Therefore, the values resulting from our analysis should not be considered definitive measures of the performance of the other tools. A more accurate estimate of the performance of the other tools would be obtained by comparison with a structured interview or clinician's diagnosis as the gold standard. However, the purpose of the paper was to demonstrate the application of these statistical methods to detection of emotional distress in oncology patients, and this demonstration is not affected by the quality of the gold standard.

A second point to note is that whilst SE, SP and likelihood ratios are unaffected by the prevalence of disease (that is, pre-test probability), post-test probabilities are affected by prevalence. Thus, the performance of these indices will need to be re-established for new patient populations, since prevalence may vary across populations [33]. Further to this, the 23% response rate to the survey would affect how well our results might generalise to other centres in other countries and cultures. Consequently, our data should not be considered to provide the definitive validation of the tests that were studied. However, the statistical methods described are not affected by the external validity of our results.

A final point to reiterate is that the simple combination of tests requires that the tests be independent [16]. Since psychological tests are likely to be highly correlated, multiple logistic regression analysis should be used, as in this study, to examine whether combining tests leads to improved accuracy despite lack of independence between tests. Additionally, despite the confirmation derived from the logistic regression, the lack of independence between tests means that the post-test probabilities reported for the combined tests represent an over-estimation of the accuracy of the algorithm.

Conclusion

Our clinical aim has been to minimise the burden on patients and staff whilst maximising screening effectiveness. The algorithm we have developed reduces the number of items completed by each patient to the minimum necessary. Since the majority (71% in this study) of patients score below threshold on the DT, the burden of screening for patients and staff alike is reduced.

The application of the statistical methods described in this paper to the detection of emotional distress amongst oncology outpatients provides a useful basis for evaluating screening algorithms for referral to clinical services such as Psycho-Oncology. Important future steps in this process are the use of an improved “gold standard” such as a structured clinical interview and calculation of the statistics for different patient populations in other centres.
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References

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