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## A procedure for obtaining Impact of Cancer Version 2 scores using Version 1 responses

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### Abstract

**Purpose**—Psychometric scales often change over time, complicating comparison of scores across different versions. The Impact of Cancer (IOC) scale was developed to measure quality of life of long-term cancer survivors. We sought to develop a method for scoring the earlier version, IOCv1, to obtain scores comparable to IOCv2, which is the recommended version.

**Methods**—Data from 1828 cancer survivors who had completed a questionnaire including all IOCv1 and IOCv2 items were randomly split into training, validation and test sets. The training and validation sets were used to develop and validate linear regression models for predicting each IOCv2 item missing from IOCv1. The models were then applied to the test set to obtain pseudo-IOCv2 scores, which were compared to observed scores to assess predictive performance of the models in independent data.

**Results**—Observed and pseudo-IOCv2 scale scores were highly correlated in the test sample and had mean differences near zero. The models performed especially well in predicting summary scale scores, with correlations exceeding 0.98.

**Conclusions**—The approach facilitates comparison across samples of survivors surveyed using different versions of the IOC and may be useful to other investigators trying to compare participants surveyed using different versions of the same instrument.

### Keywords

impact of cancer; oncology; psychometric scales; quality of life; cancer survivorship

## INTRODUCTION

Psychometric scales are critical tools for measuring quality of life outcomes. Through a process of feedback and refinement, psychometric scales often change over time, with items and multi-item scales being added, deleted or modified. While this process yields improved instruments, it also creates the problem of comparing scores across different versions of the scale.

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The Impact of Cancer (IOC) [1–4] is an example of a psychometric scale that has evolved over time. The IOC was developed specifically to measure psychosocial aspects of long-term (more than 5 years post-diagnosis) cancer survivorship not captured by other health-related quality of life instruments. An initial scaling of the IOC was conducted using data collected from 193 long-term cancer survivors. These analyses yielded the IOC version 1 (IOCv1), which included 10 subscales measured by 41 items, as well as positive and negative summary scales [3; 4]. Due to the small sample size, factor analyses were conducted using a priori domains. A more comprehensive scaling of the IOC was conducted several years later with a sample of 1,188 long-term survivors. This scaling process involved de novo factor analysis without a priori domains as well as split-sample cross-validation and evaluation of construct and concurrent validity. This yielded the IOC version 2 (IOCv2), with eight subscales measured by 37 items, as well as positive and negative summary scales [1; 2].

Since the IOCv2 underwent more rigorous psychometric development, it is recommended that it be used rather than IOCv1. However, by the time of publication of IOCv2, studies had already been undertaken using IOCv1 [4–9], and this earlier version may continue to be used. Since IOCv2 is the recommended version, studies that have administered IOCv1 to participants may wish to score the instrument so as to obtain scores comparable to IOCv2 scores. Such “pseudo-IOCv2” scores may facilitate comparison with other cancer survivor samples surveyed using the IOCv2.

Our objective was to develop and test models for obtaining pseudo-IOCv2 scores using only IOCv1 responses.

## METHODS

### Overview

We used data collected from long-term breast cancer (n=1176) and non-Hodgkin lymphoma (n=652) survivors. Both samples had completed a questionnaire that included all items used in both the IOCv1 and IOCv2, described in [3]. Hence it was possible to compute both IOCv1 and IOCv2 scores for these participants. Our goal was to develop predictive models that utilized as input only IOCv1 item responses to obtain pseudo-IOCv2 scores that closely matched participants’ observed IOCv2 scores.

### Participants

The breast cancer survivors were participants in the Life After Cancer Epidemiology (LACE) Study, a prospective cohort study of early-stage breast cancer survivors [10]. The cohort consists of women diagnosed from age 18 to 79 years with a first primary breast cancer (Stage I–1 cm, II or IIA) recruited primarily from the Kaiser Permanente Northern California Cancer Registry and the Utah Cancer Registry. Demographic, treatment and medical characteristics of this sample are described in Crespi et al [1]. Twelve participants included in Crespi et al [1] were subsequently found to have had recurrences and were excluded from the current sample, reducing the sample size from 1,188 to 1,176. The LACE participants were mailed the self-administered questionnaire of IOC items as part of a resurvey wave.

The non-Hodgkin lymphoma survivors were identified through the Duke University and University of North Carolina at Chapel Hill Lineberger tumor registries as previously described [11]. Patients were eligible if diagnosed with non-Hodgkin lymphoma, 19 years old at diagnosis, and 2 years post-diagnosis. Characteristics of this sample are described in Crespi et al [2]. These participants were mailed the self-administered questionnaire of IOC items as part of a cross-sectional survey.

Since the IOC is intended to apply to cancer survivors rather than individuals with active disease, respondents with active disease or unknown recurrence status were excluded from the analysis. Both studies were approved by human subjects review boards and written informed consent was obtained from all participants.

## Measures

IOC items are presented as statements regarding specific impacts of cancer to which respondents indicate their level of agreement from 1 (strongly disagree) to 5 (strongly agree). IOCv1 uses 41 of these items; IOCv2 uses 37 items, some of which are on IOCv1 and some of which are not. IOCv2 also includes employment and relationship scales not considered here.

The 37 items on IOCv2 are used to compute 8 subscale scores and 2 summary scores. Subscale scores are computed as the mean of items comprising the subscale. The IOCv2 Positive Impact Summary scale is scored as the mean of the items on the Altruism/Empathy, Health Awareness, Meaning of Cancer and Positive Self-Evaluation subscales. The IOCv2 Negative Impact Summary scale is scored as the mean of the items on the Appearance Concerns, Body Change Concerns, Life Interferences and Worry subscales.

## Statistical Analysis

The combined sample of 1828 survivors was randomly divided into training, validation and test sets using an approximate 50%/30%/20% split ( $n$ 's of 927, 509 and 392, respectively). We obtained a predictive linear regression model for each IOCv2 item missing from IOCv1 using the least absolute shrinkage and selection operator (LASSO) method [12; 13] for model selection on the training set, implemented in the GLMSELECT procedure in SAS 9.2. The LASSO is a shrinkage and selection method for linear regression that minimizes the sum of squared errors with a bound on the sum of the absolute values of the coefficients as a protection against overfitting. Each IOCv2 item response targeted for prediction was used as a dependent variable and all IOCv1 item responses were included in the potential predictor pool. Average squared error for the validation data was used as the criterion for choosing among models at each step of the LASSO algorithm.

The test set was used to assess the predictive performance of the selected models on independent data not used in model selection. For participants in the test set, the selected models were used to compute pseudo-responses for IOCv2 items missing from IOCv1. These pseudo-IOCv2 item responses were used to compute pseudo-IOCv2 scale scores, computed as the mean of items comprising the scale but using pseudo-IOCv2 item responses for items not in the IOCv1 where applicable. Predictive performance was assessed by examining the distribution of differences between observed and pseudo-IOCv2 scale scores and the Pearson correlation between them.

## RESULTS

Table 1 lists the IOCv2 scales and indicates the number of items in each scale that are included or missing from IOCv1. In total, IOCv2 uses 37 items to form 8 subscales and 2 summary scales; 30 of these items are also included in IOCv1, and 7 are not and thus were targeted for prediction. The Life Interferences subscale had the highest level of missingness, with 57% (4/7) of its items not in IOCv1. Three other subscales were missing only single items. The Negative Impact summary scale had more items missing than the Positive Impact summary scale (25%, 5/20 compared to 12%, 2/17).

The LASSO algorithm selected models with 5–9 predictors for each IOCv2 item targeted for prediction (Appendix A). Table 2 summarizes the performance of model selection in terms

of the average squared error of prediction of the selected models in the training, validation and test sets for each of the seven predicted items. The average squared errors were comparable across sets, supporting the generalizability of the models to independent data.

Table 3 compares observed and pseudo-IOCv2 scores in the test set, for IOCv2 scales with missing items. In all cases, the mean difference between observed and pseudo-scores was near zero, and the standard deviation of the differences was less than 0.33, and more typically less than 0.18. The correlations indicated close agreement, especially for the summary scales, in both survivor groups and overall. The Life Interferences subscale was predicted the least accurately, but still had correlation of 0.896 in the overall test sample.

## CONCLUSION

We have developed models for obtaining pseudo-IOCv2 scale scores from IOCv1 responses that may facilitate comparison of quality of life impacts across samples of survivors surveyed using different versions of the IOC. The models had very good predictive performance in an independent test sample.

The regression models for obtaining pseudo-IOCv2 item responses are provided in Appendix A, and Appendix B provides an example of the calculations. A SAS macro for computing pseudo-IOCv2 scale scores is available from the first author.

Limitations must be acknowledged. The respondents completed an 81-item questionnaire rather than the shorter IOCv1 or IOCv2, and responses may have differed from what would have been obtained from the IOCv1 or IOCv2 due to the different context; in particular, similarity of item responses may have been enhanced. The sample was limited to breast cancer and non-Hodgkin lymphoma survivors and the models may not perform as well for individuals with other diagnoses.

Overall, the predictive performance of the models together with the substantial overlap between IOCv1 and IOCv2 suggests that investigators can use pseudo-IOCv2 scores with confidence that they are comparable to actual IOCv2 scores. Our approach may be useful to other investigators seeking to compare participant samples surveyed using different versions of the same scale.

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## Abbreviations

**IOC**      Impact of cancer

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**Table 1**

Comparison of item content of IOCv1 and IOCv2

	Total items in IOCv2 scale	Number in IOCv1	Number not in IOCv1
<b>IOCv2 Subscales</b>			
Altruism/Empathy	4	4	0
Health Awareness	4	4	0
Meaning of Cancer	5	4	1
Positive Self-Evaluation	4	3	1
Appearance Concerns	3	3	0
Body Change Concerns	3	3	0
Life Interferences	7	3	4
Worry	7	6	1
<b>IOCv2 Summary Scales</b>			
Positive Impact Summary	17	15	2
Negative Impact Summary	20	15	5
<b>Total</b>	<b>37</b>	<b>30</b>	<b>7</b>

**Table 2**  
 Comparison of average squared error of prediction of the selected models in the training, validation and test sets

Item number	Item wording	Average squared error		
		Training set	Validation set	Test set
23	Having had cancer makes me feel uncertain about my health	0.46	0.53	0.41
32	I consider myself to be a cancer survivor	0.42	0.46	0.50
58	Because of having had cancer I feel that I have more control of my life	0.68	0.57	0.67
57	I feel like cancer runs my life	0.39	0.47	0.50
67	Having had cancer has made me feel alone	0.66	0.57	0.58
68	Having had cancer has made me feel like some people do not understand me	0.78	0.70	0.69
70	Uncertainty about my future affects my decisions to make plans	1.22	1.36	1.20

“IOC” numbering corresponds to item numbers in Appendix A of Zebrack et al [3]; “IOCv2” numbering refers to numbering in the IOCv2 instrument.

**Table 3**

Comparison of observed and pseudo-IOCV2 scores in the test set (N = 392)

IOCV2 Scale	Observed IOCV2 score	Pseudo-IOCV2 score	Difference: Mean $\pm$ SD (min, max)	r, total test sample (N = 392)	r, breast cancer survivors in test sample (N = 253)	r, non-Hodgkin lymphoma survivors in test sample (N = 139)
Meaning of Cancer subscale	2.93 $\pm$ 0.92	2.93 $\pm$ 0.88	0.006 $\pm$ 0.153 (-0.42, 0.69)	0.986	0.984	0.989
Positive Self-Evaluation subscale	3.90 $\pm$ 0.79	3.90 $\pm$ 0.74	-0.002 $\pm$ 0.172 (-0.68, 0.58)	0.976	0.978	0.976
Life Interferences subscale	1.97 $\pm$ 0.66	1.95 $\pm$ 0.44	0.021 $\pm$ 0.329 (-0.65, 1.31)	0.896	0.920	0.864
Worry subscale	2.74 $\pm$ 0.90	2.72 $\pm$ 0.87	0.011 $\pm$ 0.010 (-0.29, 0.39)	0.994	0.994	0.995
Positive Impact Summary scale	3.52 $\pm$ 0.65	3.52 $\pm$ 0.64	0.001 $\pm$ 0.061 (-0.17, 0.20)	0.996	0.996	0.996
Negative Impact Summary scale	2.38 $\pm$ 0.71	2.37 $\pm$ 0.64	0.010 $\pm$ 0.128 (-0.27, 0.48)	0.988	0.988	0.988



APPENDIX A

Regression coefficients to be used to compute IOCv2 pseudo-item responses from IOCv1 items

IOCv1 number <sup>†</sup>	IOC number <sup>‡</sup>	Predictor Item wording	Regression coefficients by missing IOCv2 item: IOCv2 number <sup>‡</sup> (IOC number <sup>†</sup> )												
			12 (23)	5 (32)	37 (58)	27 (57)	28 (67)	29 (68)	30 (70)						
		Intercept	0.594	2.798	0.603	0.857	1.178	1.126	1.246						
2	8	Having had cancer makes me feel unsure about my future	0.125			0.012		0.017	0.024						
3	9	I worry about my future		-0.007			0.097								
5	12	I feel like time in my life is running out	0.028		-0.010										
7	14	Having had cancer has strengthened my religious faith or sense of spirituality		0.018											
11	19	I worry about my health	0.100												
12	21	I worry about the cancer coming back or about getting another cancer	0.175												
13	22	New symptoms make me worry about the cancer coming back	0.262					0.035	0.015						
15	25	I am bothered that my body cannot do what it could before having had cancer	0.043					0.021							
17	27	I feel disfigured			0.018			0.017							
20	30	Having to pay attention to my physical health interferes with my life				0.059	0.012	0.060							
21	33	I feel a sense of pride or accomplishment from surviving cancer		0.356											
22	34	I learned something about myself because of having had cancer		0.058											
23	35	I am angry about having had cancer				0.123	0.048								
24	36	I feel guilty for somehow being responsible for getting cancer		-0.036				0.070							
25	37	I feel that I am a role model to other people with cancer			0.020										
26	39	Having had cancer has made me feel old	0.057			0.087	0.088	0.016							
27	40	I feel guilty today for not having been available to my family when I had cancer				0.035	0.013	0.036	0.120						
28	43	Having had cancer has been the most difficult experience in my life												0.059	
32	54	Because of cancer I have become better about expressing what I want			0.115										
33	55	Because of cancer I have more confidence in myself			0.299										
34	56	Having had cancer has given me direction in life			0.238										
39	65	I feel that I should give something back to others because I survived cancer			0.024										

IOCv1 number <sup>†</sup>	IOC number <sup>†</sup>	Item wording	Regression coefficients by missing IOCv2 item: IOCv2 number <sup>†</sup> (IOC number <sup>†</sup> )											
			12 (23)	5 (32)	37 (58)	27 (57)	28 (67)	29 (68)	30 (70)					
40	72	Having had cancer keeps me from doing activities I enjoy			-0.062									
41	73	Ongoing cancer-or treatment-related symptoms interfere with my life				0.050	0.038	0.106						

<sup>†</sup>,"IOC": numbering corresponds to item numbers in Appendix A of Zebrack et al [3]; "IOCv1": numbering refers to numbering in the IOCv1 instrument; "IOCv2": numbering refers to numbering in the IOCv2 instrument.

APPENDIX B

Example of calculation of pseudo-IOCv2 item responses, subscale and summary scores for one respondent

Items	Item Ref. Numbers		Observed IOCv1 responses	Pseudo-IOCv2 responses	Pseudo-IOCv2 subscale scores	Pseudo-IOCv2 summary scale scores
	IOC	IOCv1				
I feel a special bond with people with cancer	62	36	22	4	Altruism/ Empathy	3.50
Because I had cancer I am more understanding of what other people may feel when ill	63	37	23	4		
Having had cancer has made me more willing to help others	64	38	24	3		
I feel that I should give something back to others because I survived cancer	65	39	25	3	Health Awareness	2.75
I do not take my body for granted since the cancer	15	8	1	3		
Having had cancer has made me more concerned about my health	16	9	2	2		
I am more aware of physical problems or changes in my body since having had cancer	17	10	3	3	Meaning of Cancer	2.92
Having had cancer has made me take better care of myself (my health)	29	19	4	3		
Having had cancer turned into a reason to make changes in my life	53	31	33	3		
Because of cancer I have become better about expressing what I want	54	32	34	3	Positive Self- Evaluation	3.86
Because of cancer I have more confidence in myself	55	33	35	3		
Having had cancer has given me direction in life	56	34	36	3		
Because of having had cancer I feel that I have more control of my life	58	NA	37	NA	Appearance Concerns	2.33
I consider myself to be a cancer survivor	32	NA	5	NA		
I feel a sense of pride or accomplishment from surviving cancer	33	21	6	4		
I learned something about myself because of having had cancer	34	22	7	4	Body Change Concerns	3.00
I feel that I am a role model to other people with cancer	37	25	8	3		
I worry about how my body looks	26	16	19	2		
I feel disgraced	27	17	20	2	Life Inter- ferences	2.15
I sometimes wear clothing to cover up parts of my body I do not want others to see	28	18	21	3		
I am concerned that my energy has not returned to what it was before I had cancer	24	14	16	3		
I am bothered that my body cannot do what it could before having had cancer	25	15	17	3	Worry	2.51
Having had cancer has made me feel old	39	16	18	3		
I feel guilty today for not having been available to my family when I had cancer	40	27	26	3		
I feel like cancer runs my life	57	NA	27	NA	Positive Summary Scale	3.24
Having had cancer has made me feel alone	67	NA	28	NA		
Having had cancer has made me feel like some people do not understand me	68	NA	29	NA		
Uncertainty about my future affects my decisions to make plans	70	NA	30	NA	Negative Summary Scale	2.43
Having had cancer keeps me from doing activities I enjoy	72	40	31	2		
Ongoing cancer-related or treatment-related symptoms interfere with my life	73	41	32	2		
Having had cancer makes me feel unsure about my future	8	2	9	2	Appearance Concerns	2.33
I feel like time in my life is running out	12	5	10	2		
I worry about the cancer coming back or about getting another cancer	21	12	11	3		
Having had cancer makes me feel uncertain about my health	23	NA	12	NA	Body Change Concerns	3.00
I worry about my future	9	3	13	3		
New symptoms make me worry about the cancer coming back	22	13	14	2		
I worry about my health	19	11	15	3	Life Inter- ferences	2.15

I learned something about life because of having had cancer	7	1	NA	4	NA
I am afraid to die	10	4	NA	3	NA
Having had cancer has made me realize that time is precious	13	6	NA	4	NA
Having had cancer has strengthened my religious faith or my sense of spirituality	14	7	NA	5	NA
Having to pay attention to my physical health interferes with my life	30	20	NA	2	NA
I am angry about having had cancer	35	23	NA	3	NA
I feel guilty for somehow being responsible for getting cancer	36	24	NA	2	NA
Having had cancer has been the most difficult experience in my life	43	28	NA	4	NA
I wonder why I got cancer	51	29	NA	3	NA
It is important for me to know why I got cancer	52	30	NA	3	NA
I place a higher value on my relationships with family or friends than I did before	61	35	NA	4	NA

\* "IOC" numbering corresponds to item numbers in Appendix A of Zebrack et al [3]; "IOCv1" numbering refers to order in the IOCv1 instrument; "IOCv2" numbering refers to numbering in the IOCv2 instrument.

\* Predicted values of item responses obtained using regression equations in Appendix A.