

Exploring barriers to the receipt of necessary medical care among cancer survivors under age 65 years

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Abstract

Purpose With increasing cancer care costs and greater patient cost-sharing in the USA, understanding access to medical care among cancer survivors is imperative. This study aims to identify financial, psychosocial, and cancer-related barriers to the receipt of medical care, tests, or treatments deemed necessary by the doctor or patient for cancer among cancer survivors age < 65 years.

Methods We used data on 4321 cancer survivors aged 18–64 years who completed the 2012 LIVESTRONG Survey. Multivariable logistic regression was used to identify risk factors associated with the receipt of necessary medical care, including sociodemographic, financial hardship, debt amount, caregiver status, and cancer-related variables.

Results Approximately 28% of cancer survivors were within 1 year, and 43% between 1 and 5 years, since their last treatment at the time of survey. Nearly 9% of cancer survivors

The findings and conclusions in this report are those of the authors and do not necessarily represent the official position of the American Cancer Society, Centers for Disease Control and Prevention, National Cancer Institute, or the Department of Health and Human Services.

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reported not receiving necessary medical care. Compared to survivors without financial hardship, the likelihood of not receiving necessary medical care significantly increased as the amount of debt increased among those with financial hardship (RR_{Financial hardship w/< \$10,000 debt} = 1.94, 95% CI 1.55–2.42, and RR RR_{Financial hardship w/> \$10,000 debt} = 3.41, 95% CI 2.69–4.33, p < 0.001). Survivors who reported lack of a caregiver, being uninsured, and not receiving help understanding medical bills were significantly more likely to not receive necessary medical care.

Conclusion We identified key financial and insurance risk factors that may serve as significant barriers to the receipt of necessary medical care among cancer survivors age < 65 in the USA

Implications for cancer survivors The majority of cancer survivors reported receiving medical care either they or their doctors deemed necessary. However, identifying potentially

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modifiable barriers to receipt of necessary medical cancer care among cancer survivors age < 65 is imperative for developing interventions to ensure equitable access to care and reducing cancer disparities.

Keywords Access to care; financial hardship \cdot Cancer survivors \cdot Medical debt \cdot Disparities

An estimated 15.5 million people were alive in the USA in 2016 who had received a cancer diagnosis (cancer survivors), with this number projected to reach more than 20 million by 2026 due largely to population changes and an increase in the number of older adults [1]. Advances in cancer therapy have led to significant improvements in survival for many patient populations [2]. However, costs of cancer care are expected to reach at least \$158 billion by 2020 and are rising faster than other medical sectors [3, 4]. In conjunction with higher costs, out-of-pocket (OOP) expenses are increasing and have become a growing concern for patients and their families [5]. Although the number of uninsured Americans has decreased by 20.2 million since the enactment of Affordable Care Act (ACA) in 2010, approximately 24.4 million adults ages 18-64 years were uninsured in early 2016 [6] and others remained underinsured due to high cost-sharing requirements [7]. Since 2010, health plan deductibles for individuals increased by 66%, although wages only increased by 10% [8]. Meanwhile, cancer drugs account for some of the most expensive medications available, with a single cancer drug costing as much as \$120,000 per year [9]. As a result, even insured patients with cancer may face annual OOP expenses of \$25,000 or more for medical care [9]. Furthermore, prior studies indicate that nearly 30% of cancer survivors younger than 65 years of age experience material financial hardship (e.g., going into debt, filing for bankruptcy, or inability to cover medical care costs) [10] and approximately 13% of cancer survivors under age 65 who report financial hardship indicate incurring debt amounts of \geq \$50,000 [11]. The amalgamation of the increasing costs of cancer care and high patient costsharing burden, therefore, may adversely impact medical care utilization for many patients diagnosed with cancer.

Although studies have evaluated the influence of costsharing on treatment use and adherence among patients with cancer [12–16], a limited number of studies have examined a broader range of risk factors associated with the receipt of necessary medical care among patients in different phases of the cancer care continuum (e.g., in-treatment, post-treatment, survivorship, and surveillance care) [17–22]. Among these studies, only a handful have focused on necessary medical care use among cancer survivors who are not age-eligible for Medicare [19–22], despite more than one third of cancer survivors in the USA are age < 65 years [23]. Keegan et al. [21] found that, among adolescent and young adult cancer survivors, lack of health insurance and employment were barriers to receipt of necessary care. A recent study by Zheng et al. [20] found that cancer survivors aged 18-64 were more likely to change their prescription drug use for financial reasons, compared to their counterparts without a cancer history. Cancer survivors younger than 65 years are at greater risk for financial hardship from cancer [10] and may encounter unique challenges associated with access to medical care. Particularly, given the potential impact of cancer diagnosis and treatment on late or long-term effects, the ability to work and perform work-related tasks [24, 25], productivity losses [26], and the reliance on employment for health insurance coverage and as the key source of income. To address this gap in knowledge, we sought to conduct an assessment of the barriers to receipt of medical care, tests, or treatments deemed necessary by the doctor or patient for cancer among survivors younger than 65 years of age. These barriers can be broadly classified as sociodemographic, financial hardship, debt amount, employment, caregiver status, number of cancer diagnosis,s and time since cancer treatment.

Methods

Study population

We examined data from 4321 adults aged 18–64 years who responded to the 2012 LIVESTRONG Survey for People Affected by Cancer [27]. The online survey (available in English and Spanish) was designed to elucidate the needs of individuals diagnosed with cancer, both during and after their cancer treatment. Survey respondents were recruited through outreach efforts of the LIVESTRONG Foundation constituency (e.g., donors, participants at events or programs, advocates, and others in the community), social media, and partnering national and community-based organizations. We excluded respondents who did not have a personal history of cancer (e.g., family members, caregivers, and other respondents who had not survived cancer themselves), those who resided outside the USA or a US territory, and those who were aged ≥ 65 years at the time of the survey.

Measures

The 2012 LIVESTRONG survey used the same measures to assess financial hardship among cancer survivors as did the 2011 Medical Expenditure Panel Survey (MEPS) Experiences with Cancer Survivorship Survey [28]. All questions in the MEPS experiences with cancer survey were developed based on established survey items and refined through cognitive testing of a representative group of more than 50 cancer survivors. More details about the MEPS survey design, cognitive testing, and content are available elsewhere [28, 29].



Receipt of necessary medical care

Participant responses to the survey item "At any time since you were first diagnosed with cancer, did you get all of the medical care, tests, or treatments that you or your doctor believed were necessary?" was the dependent variable of interest. This item had potential responses of "yes" or "no" and was located in a section of the survey that asked participants about their medical care for cancer. We created a dichotomous variable, receipt of necessary medical care, based on participants' responses (Yes = 1 or No = 0).

Potential barriers to the receipt of necessary medical care

The independent variables included in our analysis were selected based on extant literature and previous research of factors associated with receipt of medical care among individuals diagnosed with cancer [16-19, 30, 31] and informed by the Andersen behavioral model of health care utilization [32] (Supplemental Table 1). Financial hardship associated with cancer was the primary independent variable of interest and was defined as previously reported [10] based on participants' responses to four survey items: (1) Have you or has anyone in your family had to borrow money or go into debt because of your cancer, its treatment, or the lasting effects of that treatment? (2) Did you or your family ever file for bankruptcy because of your cancer, its treatment, or the lasting effects of that treatment? (3) Have you or your family had to make any other kinds of financial sacrifices because of your cancer, its treatment, or the lasting effects of that treatment? and (4) Have you ever been unable to cover your share of the cost of those visits? Participants who responded "Yes" to any (one or more) of the four financial hardship measures were defined as experiencing financial hardship associated with cancer. Participants who responded "No" to all four financial hardship measures were defined as not experiencing financial hardship.

We also included information on the amount of money borrowed/debt incurred, based on answers to the question "How much did you or your family borrow, or how much debt did you incur because of your cancer, its treatment, or the lasting effects of that treatment?"; presence of a caregiver, "Since the time you were first diagnosed with cancer, has any friend or family member provided care to you during or after your cancer treatment?"; and help understanding medical bills, "Did you ever receive help understanding health insurance or medical bills?" We measured change in employment as any extended leave (paid or unpaid) or switch to part time employment due to cancer. Cancer-related characteristics included the number of cancer diagnoses and time since the last cancer treatment. Sociodemographic characteristics collected at the time of the survey, included age, sex/marital status, race/ethnicity, annual household income, educational attainment, and health insurance status. Sex and marital status were combined in our analysis (male/married, male/not married, female/married, female/not married) based on our prior work, in which this combination was found to be a valid way to assess these variables among cancer survivors under age 65 years given that each stratum has been shown to have different distributions of financial burden [11]. Accordingly, this aligns with our reported conceptual model approach as presented in Supplemental Table 1.

Statistical analyses

We used a two-pronged approach to identify potential barriers to the receipt of necessary medical care. Our primary approach was to select a fixed set of independent variables based on existing scientific research regarding barriers to receipt of necessary medical care (conceptually driven approach) and analytic constraints due to sample size and frequency of responses to each measure [33]. Second, we applied signal detection methodology (data-driven approach) to identify additional potential barriers. For the data-driven approach, we included variables likely to be associated with receipt of necessary medical care but not selected for our conceptually driven model, as well as reconsidered optimal cut-points or groupings for categorical and composite variables included in the conceptually driven model. For example, instead of using the financial hardship measure only, we assessed the association of a composite variable that combined the amount of money borrowed/ debt incurred measure with the financial hardship measure. Supplemental Table 1 describes the variables included in each model, using the conceptually driven and data-driven approaches.

Signal detection has been shown to be useful when analyzing data with highly collinear independent variables and potential interactions between independent variables and has been applied in a wide range of biomedical research projects [34–36]. Signal detection identifies and classifies variables by evaluating receiver operating characteristic (ROC) curves across all independent variables, as well as across all categorizations of the independent variables. The result is a decision tree that balances optimal sensitivity and specificity in discriminating between participants who do and do not have the outcome of interest. In our study, this led to the identification of variables that best distinguish between cancer survivors who did and did not receive necessary medical care. We examined variables presented in the data-driven approach in Supplemental Table 1. We used those empirically identified as stronger predictors (stopping rule of p < 0.05) than those included in the conceptually driven model to develop the final multivariable model.

Our use of a two-pronged approach in this study was possible given the availability of comprehensive survey data, which provided the opportunity to identify important factors associated with the receipt of medical care that may have



otherwise been overlooked if we relied solely on conceptual models to frame the analysis. By integrating the conceptual and data-driven approaches to modeling, we increased efficiency and, more importantly, developed a more comprehensive model of healthcare burden in a population of cancer survivors younger than 65 years of age.

We calculated descriptive statistics for all measures included in the analysis. Logistic regression was used to estimate associations between the receipt of necessary medical care and the independent variables. We fit bivariate logistic regression models for each independent variable, as well as multivariable logistic regression models for the conceptually driven and final models. Comparisons between the conceptually driven and final multivariable models were made using a Vuong test with non-nested models and a likelihood-ratio test for nested models [37]. Adjusted risk ratios were calculated in order to facilitate interpretation and discussion [38]. All statistical tests assumed a two-sided alpha of 0.05. Analyses were conducted using a combination of SAS 9.4, Stata 13.1, and signal detection software publically available from Stanford University [35].

Results

Slightly less than half of the cancer survivors were ages 40–54 years (47%), 35% were ages 55–64 years, and 18% were ages 18–39 years (Table 1). The majority of cancer survivors were non-Hispanic white (88%), female (66%), and married (70%), and had a bachelor's degree or higher (63%) and private health insurance (88%). Approximately 43% had an annual income ≥ \$80,000, and 87% were employed. In addition, an estimated 89% of survivors had a caregiver and 75% had one lifetime cancer diagnosis only. About 28% of cancer survivors were within 1 year, and 43% between 1 and 5 years, since their last treatment at the time of survey. Overall, an estimated 9% of cancer survivors did not receive necessary medical care.

Results of the bivariate analysis of variables included in the conceptually driven and data-driven models are presented in Table 2. Not receiving necessary medical care was significantly more likely among survivors who experienced financial hardship (p < 0.001), had public insurance or were uninsured/other (p < 0.001), and were unemployed or employed at diagnosis and made work changes (p = 0.015), compared to those survivors who did not experience financial hardship, had private insurance, and were employed at diagnosis but did not make work changes. Further, female survivors (both married and non-married) (p = 0.005), those with ≥ 2 cancer diagnoses (p = 0.001) and those who did not have a caregiver (p = 0.018), were significantly more likely not to have received necessary medical care than married male survivors, those with only one cancer diagnosis, and those who had a caregiver.

There was an inverse association between annual income and not receiving necessary medical care, such that compared to those in the highest income category (\geq \$120,000), those with a lower income were more likely not to receive necessary medical care (p < 0.001). Based on the data-driven model, we identified two additional variables strongly associated with receipt of necessary medical care and included them in the final multivariable model: (1) the composite measure of experiencing financial hardship and amount of debt incurred and (2) receiving help understanding health insurance or medical bills (Table 2).

The final multivariable regression model results are presented in Table 3, including the risk factors identified in the data-driven approach in the final multivariable model improved model fit compared to the conceptually driven model, as measured by a likelihood-ratio test ($\chi^2 = 61.6$, p < 0.001) (Supplemental Table 2). Among those experiencing financial hardship, the likelihood of not receiving necessary medical care significantly increased, in a stepwise manner, as the amount of debt increased. Specifically, compared to cancer survivors who did not experience financial hardship, survivors who experienced financial hardship and incurred debt <\$10,000 were nearly twice as likely not to receive necessary medical care (RR_{Financial hardship w/< \$10,000 debt = 1.94, 95% CI} 1.55–2.42, p < 0.001), and survivors who experienced financial hardship and incurred debt ≥ \$10,000 were 3.4 times more likely not to receive necessary medical care ($RR_{Financial\ hardship}$ $_{\text{w/}} \lesssim 10,000 \text{ debt} = 3.41,95\% \text{ CI } 2.69-4.33, p < 0.001)$. Survivors who were uninsured were more likely not to receive necessary care, compared to those with private insurance (RR = 1.70, 95% CI 1.27–2.28, p = 0.001), while the association for public insurance was attenuated in the fully adjusted model. Not having a caregiver was significantly associated with a greater likelihood of not receiving necessary medical care (RR = 1.44, 95% CI 1.11–1.87, p = 0.008), compared to survivors with a caregiver. Having two or more cancer diagnoses was associated with greater likelihood of not receiving necessary medical care (RR = 1.24, 95% CI 1.01-1.52, p = 0.040), compared to survivors with a single cancer diagnosis. Survivors who reported that they did not receive help understanding their health insurance or medical bills were more likely to not receive necessary medical care (RR = 2.17, 95% CI 1.68–2.81, p < 0.001), compared to those who reported receiving help.

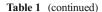
Discussion

In this study, we identified significant barriers to the receipt of necessary medical care in a large sample of adult cancer survivors less than 65 years of age in the US survivors experiencing financial hardship from cancer were most likely to report not receiving medical care either they or their doctors deemed necessary. The likelihood of not receiving necessary medical



Table 1 Characteristics of adult cancer survivors under age 65, 2012 LIVESTRONG survey

Total sample $n = 4321$	
Age, years	n (%)
18–39	778 (18.0)
40–54	2036 (47.1)
55–64	1507 (34.9)
Marital status/sex ^a	
Non-married male	361 (8.4)
Married male	1057 (24.5)
Non-married female	886 (20.5)
Married female	1967 (45.5)
Race/Ethnicity	
Non-Hispanic White	3815 (88.3)
Other ^b	506 (11.7)
Annual income	
≥ \$120,000	911 (21.1)
\$80,001–119,999	948 (21.9)
\$40,001–80,000	1111 (25.7)
≤\$40,000	736 (17.0)
Missing/decline to answer	615 (14.2)
Education	
Bachelor's degree or higher	2741 (63.4)
Some college	1257 (29.1)
High school graduate or less	323 (7.5)
Insurance	
Private	3808 (88.1)
Government	260 (6.0)
Uninsured/other	253 (5.9)
Changes to Employment	
Employed/work changes	2046 (47.4)
Employed/no work changes	1689 (39.1)
Not employed	586 (13.6)
Caregiver	
Yes	3861 (89.4)
No	460 (10.7)
Number of cancer diagnoses	
1	3234 (74.8)
≥ 2	1087 (25.2)
Time since last treatment	
1 year	1189 (27.5)
> 1–5 years	1841 (42.6)
> 5 years	1200 (27.8)
Never treated/missing	91 (2.1)
Receipt of all necessary medical care	
Yes	3926 (90.99
No	395 (9.1%)
Financial hardship and debt amount	2.0 (3.170)
No financial hardship	1968 (45.59



Total	sample
n = 4	321

$n = \pm 321$	
Hardship, with > \$10,000 in debt	814 (18.8%)
Financial hardship components ^c	
Borrowed money	2864 (66.3%)
Filed for bankruptcy	133 (3.1%)
Other financial sacrifices	1724 (39.9%)
Unable to cover costs	1123 (26.0%)
Received help understanding bills	
Yes or missing/NA	4089 (94.6%)
No	232 (5.4%)

Percentages may not add to 100% due to rounding. Respondents with missing information on annual income, time since last treatment and receive help understanding medical bills were coded as a unique category or incorporated into an existing category, as presented in the table; there was no other missing information

^a "Married" includes married or domestic partner, while "Non-married" includes single, separated, divorced, widowed, prefer not to answer. Sex and marital status were combined in our analysis (male/married, male/not married, female/married, female/not married) based on our prior work, in which this combination was found to be a valid way to assess these variables among cancer survivors under age 65 years given that each stratum has been shown to have different distributions of financial burden

^b Includes non-Hispanic Black, Hispanic, non-Hispanic American Indian/ Alaskan Native, non-Hispanic Asian/Pacific Islander, other non-Hispanic

care increased as the amount of debt increased. Specifically, cancer survivors experiencing financial hardship with debt < \$10,000 were 1.9 times more likely to not receive necessary medical care, and survivors in financial hardship with $\ge \$10,000$ of debt were 3.4 times more likely to not receive necessary medical care than survivors who did not experience financial hardship. With prior studies showing that nearly 1 in 3 cancer survivors experiences financial hardship [11, 18, 39] and that more than half of cancer survivors in debt incur amounts over \$10,000 [11, 40], our findings underscore the importance of identifying cancer survivors who may be at greatest risk for financial hardship from cancer because of the negative influence of financial burden throughout the care continuum.

A growing body of evidence indicates that cancer survivors who experience financial hardship or face high OOP costs are more likely to delay or forgo both general and cancer-related medical care, have longer times to initiation of therapy, have delays in therapy initiation, and are more likely to discontinue recommended regimens [12–15, 20, 41]. Furthermore, as trends point to increasing costs of cancer care [5] and a shift toward greater patient cost-sharing for medical care, cancer patients may face a choice between optimal care or care they can afford [42, 43]. In scenarios where medical care is interrupted or abandoned due to affordability issues, patients



^c Results not mutually exclusive

Table 2 Bivariate analysis of risk factors associated with not receiving medical care among cancer survivors aged 18–64 years

Characteristic	RR [95% CI]	p value
Conceptually driven approach		
Financial hardship ^b		< 0.001
No	Ref.	
Yes	3.29 [2.60–4.18]*	
Age, years	1 04 [0 79 1 27]	0.331
18–39 40–54	1.04 [0.78–1.37]	
55–64	1.17 [0.94–1.44] Ref.	
Marital status/sex	Kei.	0.005
Non-married male	1.23 [0.83–1.80]	0.003
Married male	Ref.	
Non-married female	1.65 [1.26–2.17]*	
Married female	1.34 [1.04–1.71]***	
Race/ethnicity		0.204
Non-Hispanic White	Ref.	
Other ^c	1.19 [0.91–1.57]	
Annual income		< 0.001
\geq \$120,000	Ref.	
\$80,001–119,999	1.25 [0.91–1.73]	
\$40,001–80,000	1.75 [1.31–2.32]*	
≤ \$40,000	2.48 [1.87–3.28]*	
Missing/decline to answer	1.27 [0.89–1.81]	
Education	Dof	0.062
Bachelor's degree or higher	Ref. 1.26 [1.03–1.54]***	
Some college		
High school graduate or less Insurance	1.26 [0.90–1.76]	< 0.001
Private	Ref.	<0.001
Government	2.05 [1.54–2.73]*	
Uninsured/other	2.46 [1.89–3.20]*	
Changes to employment		0.015
Employed/work changes	1.44 [1.10–1.90]***	
Employed/no work changes	Ref.	
Not employed	1.28 [1.04–1.58]***	
Caregiver		0.018
Yes	Ref.	
No	1.39 [1.06–1.81]***	
Number of cancer diagnoses	T. 0	0.001
1	Ref.	
≥ 2	1.41 [1.15–1.72]**	0.222
Time since last treatment 1 year	Ref.	0.232
> 1–5 years	1.01 [0.80–1.27]	
≥ 5 years	1.03 [0.80–1.32]	
Never treated/missing	1.72 [1.03–2.87]***	
Data-driven approach ^d	1./2 [1.03-2.0/]	
Financial hardship/debt incurred		< 0.001
No	Ref.	\0.001
Yes debt < \$10,000	2.21 [1.70–2.73]*	

Table 2 (continued)

Bivariate ^a		
Characteristic	RR [95% CI]	p value
Yes debt ≥ 10,000	4.32 [3.52–5.31]*	
Receive help understanding bills Yes	Ref.	<0.001
No	3.28 [2.59–5.62]*	

CI confidence interval, cont'd continued, RR risk ratio, Ref. referent category

may not receive the fullest potential health benefit and, instead, may experience higher rates of disease progression [12], adverse events [44], premature death [45], and higher overall health care expenditures due to preventable emergency room visits [46] and hospitalizations [14, 45, 47]. If the burden of financial hardship from cancer is not addressed, the consequent impact on medical care access and utilization may lead to poor health outcomes among individuals diagnosed with cancer and exacerbate disparities across a wide range of patient characteristics, including race/ethnicity and socioeconomic status.

Insurance status was also found to be significantly associated with the receipt of necessary medical care in our study. Extensive research shows the impact of the lack of health insurance and the type of health insurance on reduced access to medical care [48–52]. Our findings provide further support, showing that uninsured cancer survivors are 70% more likely to not receive necessary medical care than those survivors with private insurance. Although the future of health reform is uncertain, recent findings on the effects of the ACA show that more than 20 million US adults age 18-64 gained health insurance [53], which will also increase the proportion with access to medical care [54]. Yet, achieving the full benefit of health insurance coverage among newly and continuously insured individuals may require additional support for individuals who struggle to understand their insurance benefits and medical bills. As shown in our study, cancer survivors who did not receive help understanding their health insurance or



p < 0.001; p < 0.01; p < 0.01; p < 0.05

^a Estimates presented are based on bivariate logistic regression analyses

^b Components of financial hardship included Borrowed money, Filed for bankruptcy, Unable to cover costs of care, Other financial sacrifices

^c Other category includes non-Hispanic Black, Hispanic, non-Hispanic American Indian/Alaskan Native, non-Hispanic Asian/Pacific Islander, Other non-Hispanic

^d Only those variables found to statistically significantly improve model fit in the data-driven approach are presented. p value shown represents results of \underline{F} test for variables with more than two categories. Sex and marital status were combined in our analysis (male/married, male/not married, female/married, female/not married) based on our prior work, in which this combination was found to be a valid way to assess these variables among cancer survivors under age 65 years given that each stratum has been shown to have different distributions of financial burden

Table 3 Final multivariable analysis of risk factors associated with not receiving medical care among cancer survivors aged 18–64 years

Final	enhanced	model

Characteristic	RR [95% CI]	p value ^a
Financial hardship/debt incurred		< 0.001
No hardship	Ref.	
Hardship debt < \$10,000	1.94 [1.55–2.42]*	
Hardship debt ≥ 10,000	3.41 [2.69–4.33]*	
Age		0.457
55–64	Ref.	
40–54	1.11 [0.90–1.37]	
18–39	0.97 [0.74–1.29]	
Marital status/sex		0.074
Married male	Ref.	
Non-married male	0.93 [0.63–1.38]	
Married female	1.31 [1.03–1.67]	
Non-married female	1.23 [0.92–1.64]	
Race/ethnicity	-	0.986
Non-Hispanic White	Ref.	
Other ^b	1.00 [0.76–1.32]	
Annual income		0.384
≥ \$120,000	Ref.	
\$80,001–119,999	1.03 [0.75–1.42]	
\$40,001–80,000	1.23 [0.91–1.67]	
≤ \$40,000	1.32 [0.92–1.89]	
Missing/decline to answer	1.02 [0.71–1.46]	
Education Education	1.02 [0.71 1.40]	0.760
Bachelor's degree or higher	Ref.	0.700
Some college	0.88 [0.62–1.25]	
High school graduate or less	0.98 [0.80–1.21]	
Insurance	0.56 [0.00 1.21]	0.002
Private	Ref.	0.002
Public	1.34 [0.96–1.85]	
Uninsured/other	1.70 [1.27–2.28]*	
	1.70 [1.27–2.28]	0.524
Changes to employment	Dof	0.324
Employed/no work changes	Ref.	
Employed/work changes	1.13 [0.85–1.51]	
Not employed	0.97 [0.78–1.19]	0.000
Caregiver	D 0	0.008
Yes	Ref.	
No	1.44 [1.11–1.87]**	0.040
Number of cancer diagnoses		0.040
1	Ref.	
≥ 2	1.24 [1.01–1.52]***	
Time since last treatment		0.210
1 year	Ref.	
> 1–5 years	1.09 [0.87–1.37]	
≥ 5 years	1.22 [0.95–1.56]	
Never treated/missing	1.61 [0.96–2.68]	
Receive help understanding bills		< 0.001
Yes	Ref.	
No	2.17 [1.68–2.81]*	

Estimates presented are based on multivariable logistic regression analysis adjusted for all variables shown in table. Sex and marital status were combined in our analysis (male/married, male/not married, female/married, female/not married) based on our prior work, in which this combination was found to be a valid way to assess these variables among cancer survivors under age 65 years given that each stratum has been shown to have different distributions of financial burden

CI confidence interval, cont'd continued, RR risk ratio, Ref. referent category

^b Other category includes non-Hispanic Black, Hispanic, non-Hispanic American Indian/Alaskan Native, non-Hispanic Asian/Pacific Islander, other non-Hispanic



medical bills were more than twice as likely to report not receiving necessary medical care. Consequently, cancer survivors may require greater support to better understand their health insurance and medical bills during the time period around diagnosis and treatment, when the use of medical care is high and bills start to accumulate.

Among other factors included in our analysis of cancer survivors, we found that having a caregiver was significantly associated with the receipt of necessary medical care. Individuals with cancer face a plethora of challenges throughout the cancer care trajectory related to late and long-term effects of treatment, psychological and emotional distress, financial hardship, and managing and coordinating medical care [55-61]. Our findings that cancer survivors without a caregiver were significantly more likely not to receive necessary medical care support prior studies reporting that the presence of a caregiver may lead to improved outcomes for cancer patients, including management of care [62, 63]. We also found that having a higher number of cancer diagnoses was associated with greater likelihood of not receiving necessary medical care. This may be related to greater total costs of care associated with multiple rounds of treatment or the long-term effects of treatment.

Identifying barriers to receipt of necessary medical cancer care among cancer survivors is imperative in developing interventions that ensure equitable access to care across populations [64]. A common thread among the barriers found to be significantly associated with receipt of necessary care in our final multivariable model is their relationship to patient cost of care (financial hardship/debt amount, health insurance, help understanding health insurance, and medical bills). It is now well-established that patients face significant financial hardship from cancer, its treatment, and the late/lasting effects of treatment [10–12, 14, 18, 26, 39–41, 65–79], with populationbased estimates indicating that approximately one in every five cancer survivors report material (e.g., unable to cover medical care costs) or psychological financial hardship (e.g., worry about paying medical bills because of cancer) [10]. Yet, to date, there are no prospective studies evaluating the impact of interventions to prevent financial hardship from cancer [80]. Efforts to mitigate financial hardship from cancer and limit the impact on access and utilization of medical care will require the collection of patient financial information (e.g., examining patients' debt-to-income ratio, or information on assets and debts), as well as improved coordination and communication between patients and their health care team. First, early education of patients about their cost-sharing responsibilities for impending medical care may help them prepare for and engage in the steps necessary to manage the associated finances. Second, it is essential that physicians and other members of the health care team (e.g., nurse, medical assistant, social worker) engage in conversations about the costs of medical care, so that they become aware of their patient's

^{*}p < 0.001; **p < 0.01; ***p < 0.05

^a For variables with more than two categories represents *p* value for *F* test
^b Other category includes non-Hispanic Black Hispanic non-Hispanic

financial capability and can help identify resources (e.g., institutional medical financial assistance programs, pharmaceutical co-pay assistance programs, or third-party non-profit organizations) or cost-saving strategies [81]. Third, given that an individual's financial capability is dynamic over time, ensuring that the aforementioned information about the costs of medical care is available and "financial check-ins" occur throughout the care continuum, from the time of diagnosis through survivorship or end of life, may ensure that patients are receiving necessary care.

Despite the strengths of our innovative analytic approach with a large national sample containing detailed measures about financial hardship, our study had several limitations. First, cancer survivors responding to the LIVESTRONG online survey were recruited from multiple sources, and thus, our national study sample was not population-based. Accordingly, our findings are most generalizable to study populations with characteristics similar to the study sample, namely, cancer survivors 18-64 years of age who are predominantly non-Hispanic whites, female, married, employed, and have high educational attainment, relatively high annual incomes, and Internet access. However, preliminary studies suggest that even if prevalence estimates differ between population-based probability samples and non-probability samples, associations between patient factors and outcomes, such as those between financial hardship and receipt of necessary care presented here, are similar [82]. Second, our study data were based on self-reported information and are subject to recall bias and misclassification. Third, the findings are based on a prevalent sample of cancer survivors and those diagnosed with more lethal cancers. Fourth, those who died as a result of suboptimal care were not included in the sample. Fifth, we did not have information on specific clinical characteristics, such as stage of cancer at diagnosis, presence of comorbid conditions, and whether subsequent cancers represented recurrence for survivors with a primary diagnosis or two separate cancers. Lastly, given the cross-sectional study design, we were not able to explore the temporal pathway between the identified barriers and receipt of necessary medical care.

Conclusion

In a large sample of adult cancer survivors younger than 65 years of age in the USA, we identified several factors that may serve as significant barriers to the receipt of necessary medical care. Survivors who experience financial hardship and incur large amounts of debt related to their cancer may be at greatest risk for not receiving necessary medical care. Additionally, providing support to cancer survivors who need help understanding the complexities of insurance or medical bills may improve both access to and receipt of necessary medical care. With trends in the US health care system

pointing to increased costs of cancer care and greater patient cost-sharing, it is of paramount importance to identify and better understand barriers and facilitators to the receipt of necessary medical care throughout the cancer care continuum. Our findings will help inform the development of interventions by identifying individuals diagnosed with cancer who have the greatest need for education about the financial aspects of cancer care, health insurance benefits, the presence of a caregiver, and medical bills; these efforts may reduce the likelihood of disruption in high-quality cancer care provision and lead to improved health outcomes.

Compliance with ethical standards This article does not contain any studies with human participants performed by any of the authors. Informed consent was obtained from all individual participants included in the study.

Conflict of interest The authors declare that they have no conflicts of interest.

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