## Research Letter | Public Health

## Evaluation of Internet-Based Crowdsourced Fundraising to Cover Health Care Costs in the United States

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## Introduction

Online fundraising platforms have emerged as means to raise money for charity. Patients can also access these platforms to receive charitable contributions to support their health care costs. We sought to evaluate the use of a popular fundraising platform to cover health care-related costs, the medical conditions involved with these fundraisers, and their geographic distribution in the US.

## Methods

This serial cross-sectional study was exempted from review by the University of Missouri Kansas City institutional review board because it did not contain patient data. Participant consent was waived because all data were publicly available.

We extracted data from the GoFundMe website, from its inception in May 2010 through December 2018. A looping web scraper tool was created ${ }^{1}$ to extract the following data: text body of


Figure 1. Online Crowdsourced Fundraising Trends for Medical Conditions in the US, 2010-2018
A Online crowdsourced fundraising in the US, 2010-2018

B Online crowdsourced fundraising for different medical conditions, 2010-2018

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the fundraiser, self-tagged category, geotagged location, date of creation, target amount sought (in US dollars), and total amount raised (in US dollars). We ran the program in April 2019. Fundraisers self-tagged as medical were included.

We classified fundraisers by key conditions that pose high morbidity in the US: cancer, cardiovascular conditions, neurological conditions, and trauma or injury. ${ }^{2}$ For classification, clinical descriptors from the main text body of these fundraising campaigns were extracted using a pretrained machine learning model, ${ }^{3}$ and campaigns were then categorized into disease categories using a natural language processing algorithm through biomedical word vectors. ${ }^{4}$ A manual abstraction of 1000 randomly selected fundraisers found a $90.1 \%$ classification accuracy. Geographic tags were used to assess state-level distribution, standardized to 2010 US Census data. Finally, using linear regression, we compared the state-level prevalence of online fundraisers with the Charitable Giving Index to assess how charity patterns correlate with online fundraisers. ${ }^{5}$ Two-tailed $P<.05$ was considered statistically significant. Data analyses were performed using Python software version 3.6 (Python Software Foundation) and R statistical software version 3.6.0 (R Project for Statistical Computing) from July 2019 to February 2020 (eMethods in the Supplement).

## Results

Of the 1056455 fundraisers on the online platform in the US between May 2010 and December 2018, 281881 (26.7\%) were created to cover health care-related costs, collectively seeking $\$ 10285738$ 233. As of April 2019, \$3 663935620 had been raised. There was a large increase in the use of medical fundraisers over time; from 42 fundraisers in 2010 to 119373 in 2018 (a mean increase of 14916 fundraisers per year) (Figure 1A). In 2010, $\$ 717125$ was sought, which increased to $\$ 4663513572$ in 2018 (mean increase of $\$ 582849556$ per year).

A total of 98352 fundraisers (34.9\%) were for cancer, 53861 (19.1\%) for trauma/injury, 48963 (17.4\%) for neurological conditions, and 10143 (3.6\%) for cardiovascular conditions. The number of online medical fundraisers increased for all 4 conditions over the study period (Figure 1B). For cancer, $\$ 4481980170$ was sought ( $\$ 45571$ per fundraiser). For trauma/injury, $\$ 1609046833$ was sought (\$29874 per fundraiser). Neurological and cardiovascular conditions sought a total of \$1212452440 and \$287113 426 ( $\$ 24763$ and $\$ 28307$ per fundraiser, respectively).

Figure 2. Geographical Distribution of the Use of Online Crowdsourced Fundraising for Medical Conditions in the United States


Maine had the highest prevalence of online medical fundraisers (139.4 fundraisers per 100000 population), followed by Alaska ( 137.2 fundraisers per 100000 population) (Figure 2). Mississippi had the lowest prevalence of online medical fundraisers ( 54.6 fundraisers per 100000 population). The states with higher Charitable Giving Index had a higher prevalence of online fundraisers ( $\beta=0.072 ; P=.03 ; \beta=0.072$ ).

## Discussion

From May 2010 through December 2018, more than $\$ 10$ billion was sought through online medical fundraisers in the US, with more than $\$ 3$ billion raised. Cancer represented the most common medical condition for which funding was sought, followed by trauma/injury.

Cancer therapy is expensive, and out-of-pocket costs for newly diagnosed patients with cancer frequently represent $23 \%$ to $63 \%$ of their household income. ${ }^{6}$ Our study suggests that many patients are using online fundraisers to cope with the high financial burden due to cancer.

This study had some limitations. Although our study does not contain patient-specific clinical data and included only 1 fundraising platform, thereby representing the lower bound on the true use of such mechanisms, it highlights a unique aspect of financial toxicity of health care.

Online fundraising to cover health care-related expenditures has grown substantially over the past years. These results highlight how many people are relying on the charity of others for raising money to cover health care costs.

## ARTICLE INFORMATION

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Author Contributions: Dr Angraal had full access to all of the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis. Drs Krumholz and Spertus contributed equally as senior authors, listed alphabetically.
Concept and design: Angraal, Khera, Spertus.
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Services, through Yale New Haven Hospital, to develop and maintain measures of hospital performance; and receiving grants from Medtronic and the Food and Drug Administration, Medtronic and Johnson and Johnson, and Shenzhen Center for Health Information outside the submitted work. Dr Spertus is a consultant for United Healthcare, Novartis, Bayer, AstraZeneca, Janssen, Amgen, and Myokardia; has copyrights for the Kansas City Cardiomyopathy Questionnaire, Seattle Angina Questionnaire and Peripheral Artery Questionnaire; is on the Board of Directors of Blue Cross Blue Shield of Kansas City; and holds an equity interest in Health Outcomes Sciences. No other disclosures were reported.

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## SUPPLEMENT.

eMethods. Additional Methodology

