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# A Survey of Individuals' Willingness to Share Real-World Data Post-Mortem with Researchers

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## Abstract

Objective: As posthumous data use policy within the broader scope of navigating post-mortem data privacy is a procedurally complex landscape, our study addresses this by exploring patterns in individuals' willingness to donate data with health researchers after death and developing practical recommendations.

Methods: An electronic survey was conducted in April 2021 among adults ( $\geq$ 18 years of age) registered in ResearchMatch (www.researchmatch.org), a national health research registry. Descriptive statistics were used to observe trends in, and multinomial logistic regression analyses were conducted at a 95% confidence interval to determine the association between, willingness to donate some, all, or no data after death with researchers based on the participants' demographics (education level, age range, duration of using online medical websites, annual frequency of getting ill).

Results: Of 399 responses, most participants were willing to donate health data (electronic medical record data [67%], prescription history data [63%], genetic data [54%], and fitness tracker data [53%]) after death. Among 397 respondents, we identified that individuals were more likely to donate some data after death (versus no data) if they had longer duration of using online medical websites (adjusted relative risk ratio = 1.22, p= 0.04, 95% CI: 1.01 to 1.48). No additional significant findings were observed between willingness to donate all, some, or none of their data after death and other demographic factors.

Conclusions: Engaging patients in online medical websites may be one potential mechanism to encourage or inspire individuals to participate in posthumous data donation for health research purposes.

## Introduction

Today, in the 21<sup>st</sup> century, participation in the digital economy is not only commonplace, but also necessary for the majority of the population to engage in their day-to-day livelihoods. From searching the internet, using self-monitoring devices (i.e., wearables and fitness trackers), engaging on online banking, obtaining genetic ancestry test results, seeking medical care online, connecting on social media, online purchasing, ride-sharing, sending email and text messages, and more, the likelihood of data being stored in online accounts and individuals participating in the digital economy or development of digital assets at any age today is high. Therein lies both a concept and practice of data ownership and individual autonomy to donate data for various causes or initiatives, such as health research, during life and/or death. Those who make decisions regarding the collection and subsequent use(s) of individuals' data upon their death, or posthumous data use within the broader scope of post-mortem data privacy and discretion, must navigate a procedurally complex landscape.<sup>1-5</sup> Namely, decision-makers seeking to advance health care via secondary research (i.e., medical product research and development, comparative effectiveness research, observational research, etc.) using a wide variety of data would find it critical to promote both an understanding of and solutions to either common or unique challenges in accessing posthumous data.

For instance, decision-makers must consider existing and applicable data privacy law, review available decisions made in related cases that have been presented in arbitration or the court of law, and determine what is in the best interest and well-being of decedents' surviving family members or life/care partners.<sup>6</sup> Within the United States (US) the Health Insurance Portability and Accountability Act (HIPAA) protects individuals' personally identifiable health information or data derived from health care settings for 50 years after death.<sup>7,8</sup> Likewise, the European Convention of Human Rights also protects the confidentiality of persons' medical information upon death.<sup>9</sup> Yet, lessons learned from the legally contested commercialization of Henrietta Lacks' immortal cancer cell line, an event that predates HIPAA, and use cases surrounding HIPAA limitations and other legal paradigms, or lack thereof, concerning data send an important message.<sup>7,10,11</sup> That is in addition to procedural considerations, such as privacy boards being capable of granting a waiver of authorization for accessing decedent data on a case by case basis without prior authorization (under Section 164.512 of the Privacy Rule in the US). Today's

general lack of comprehensive, or the current presence of outdated, posthumous biobank and data use consent practices for health research are thus a potential blind spot in data use policy today, contributing to the growing importance of understanding the ethical implication surrounding individuals' willingness to share or allow sharing and use of their individual data post-mortem.

The amount of data related both directly and indirectly to health, and generated and/or stored within or outside of traditional health care settings, is unprecedented. Resulting are concerns about the sufficiency of data privacy and human subjects research protection laws, if any, to reach beyond enterprise terms of service agreements and protect against potential misuses of individual-level data of the deceased. Comprehensive laws such as the 2014 Uniform Fiduciary Access to Digital Assets Act (UFADAA; including its revision called RUFADAA) legally provides data subjects and their fiduciaries ownership and dictation rights over digital assets in the event a data subject or owner dies or becomes incapacitated.<sup>12</sup> Yet, privacy law protections are limited or uneven at best. For instance, the European General Data Protection Regulation does not apply to deceased individuals and the new Washington My Health My Data Act in cases of deceased individuals.<sup>13,14</sup> One legal scholar noted that the California Consumer Privacy Act "CCPA stops short of empowering the personal representatives of decedents to exercise control over personal data according to the decedent's wishes."<sup>1</sup> Lastly, the US Common Rule does not consider research involving deceased individuals as human subjects research (must be a 'living individual; 45 CFR 46.102[e1]) and thus does not require institutional review board oversight of research involving exclusively deceased individuals.<sup>15</sup>

A systematic review shows that individuals and their relatives, who might serve as personal representatives, are willing to share data with health researchers when given sufficient opportunities, within or outside of legal processes, to plan for and dictate uses of their data assets before becoming deceased.<sup>16</sup> Further insights to help navigate this legally and procedurally complex frontier are necessary to drive innovative and trustworthy data-driven health research and reduce risk of data misuse for deceased individuals and their families, former caregivers, etc. In this paper, we report findings from a national survey eliciting individuals' willingness to donate various amounts of data across several sources after death with health researchers. We also evaluate how demographic factors might influence individuals' willingness to donate data

after death. When considered alongside current and emerging evidence, policy, and commentary, our present findings will be useful to researchers, practitioners, and data subjects seeking to make immediate decisions about and/or collaborate on the development of policies, consent tools, and/or practices focused on posthumous data use within the broader scope of post-mortem data privacy.

#### Methods

#### Survey Development, Validation, and Distribution

The survey was developed, validated, and distributed in April 2021 and as described in detail in our prior work.<sup>17,18</sup> The survey was made available to participants, who agreed to be contacted, using online Qualtrics software. Survey participants aged 18 years and older were identified and contacted online using the ResearchMatch online platform, a "disease-neutral, Web-based recruitment registry to help match individuals who wish to participate in clinical research studies with researchers actively searching for volunteers throughout the US."

## Response Data Collection & Analysis

This analysis centers on participant responses based on four demographical items (independent variables) and two items focused on willingness to share sources of data with researchers (dependent variables). The present analysis centers on ResearchMatch participants who fully completed and submitted the survey online via Qualtrics (including completed surveys with items containing no responses. A Qualtrics software tool was used to calculate an ideal sample size (n= 384) needed to survey to achieve results that are representative at a 95% CI; 5% margin of error based on the then-total number of participants within ResearchMatch registry (n= 148,090 as of April 2021). To observe the association between willingness to donate data after death and demographic variables, we fitted multinomial logistic regression models using each willingness to donate real-world data after death outcome as a dependent variable (no data, some data [willing to donate data from at least one source], or all data [willing to donate data from every source]). Results from a recent systematic review and a survey study each showed that age, income level, and education level are the strongest predictors of online or digital footprint activity.<sup>19,20</sup> Therefore, independent variables assessed in our present survey were education level, age range, duration of using online medical websites, and annual frequency of getting ill

(see Table 1). Results were reported as unadjusted and adjusted relative risk ratios (RRRs) with 95% confidence intervals (excluding "Unsure" responses to willingness to donate after death and demographic questions from our analysis due to lack of meaningful interpretation). Descriptive analyses were conducted using Microsoft Excel and all logistic regression analyses were conducted using Stata version 17.0 Standard Edition.

*Table 1.* Demographic variables (age range, education level, duration of using online medical websites, annual frequency of getting ill) and willingness to donate specific real-world data sources after death

Demographic Variables	
Education Levels	Age Ranges (years)
• High school	• 18 to 30 (Under 30)
Some College/Associates/Trade School	• 31 to 40
• Bachelors	• 41 to 50
• Masters	• 51 to 60
• Doctorate or other terminal degree	• Over 60
Duration of Using Online Medical Websites (years)	Annual Frequency of Getting Ill
• Never	• Less than 1
• Less than 1	• 2 to 3
• 2 to 3	• 4 to 6
• 4 to 5	• 7 to 10
• 6 to 7	• More than 10
• More than 7	
Real-World Data Sources (Willingness to Donate No	one, Some, or All)
Social media data	Online browsing or streaming data
Facebook data	• Music streaming data (Spotify,
• Twitter data	Pandora, etc.)
Instagram data	Google search history
• Snapchat data	Financial data
• Yelp reviews and ratings	• Online purchase history (Amazon,

Health data	Target, Ebay, etc.)		
• Fitness tracker data (FitBit, Apple Watch, etc.)	• Tax records and income history		
• Prescription history (CVS, Walgreen's, etc.)	• Credit card statement data		
• Electronic medical record data	Location data		
• Genetic data (23andMe, etc.)	• Ride-sharing history (Uber, Lyft,		
Direct communication data	etc.)		
• Text Message and Phone Call Data	• Geolocation (GPS from your phone		
• Email History (Gmail, Yahoo, Comcast,	or computer) data		
Verizon, etc.)	Voting history data		

## Ethics Review, Oversight, and Approval

ResearchMatch is a registry and collaborative project that is maintained at Vanderbilt University and overseen by the Vanderbilt University Institutional Review Board. The present study was reviewed and approved by the Ohio University Institutional Review Board under protocol #20-E-457 and Harvard Pilgrim Health Care Institute Institutional Review Board under protocol #1687515-2 as exempt under review (category 2). ResearchMatch participants' completion of the survey implied their formal written consent to engage in the survey.

## Results

## **Overall Participant Characteristics**

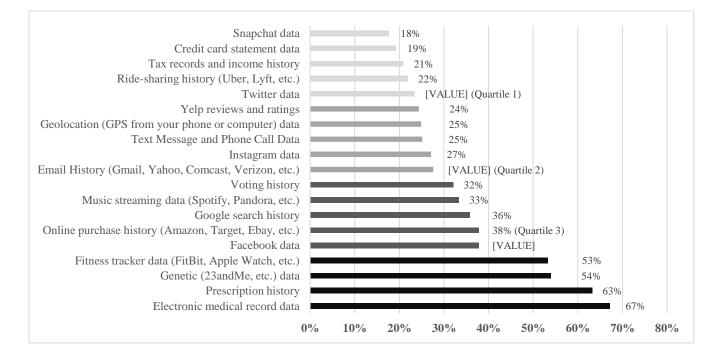
Overall participant characteristics were as described in our prior work.<sup>17,18</sup> Among 470 participants who initiated the survey, 402 completed and submitted at least one response to the survey questions (86% completion rate). An overall majority of the of the survey participants were over the age of 21 (99%); held either some college/associates/trade school, a bachelors' degree, or masters' degree (87%); used online medical websites for 7 years or more (56%); and reported an annual frequency of getting ill of six occurrences or less (94%).

## Willingness to Donate Data After Death

Among participants who indicated willingness/unwillingness to donate data after death (n= 397), regardless of demographic details provided, 7.3% (n= 29) were willing to donate all data, 86%

(n= 342) were willing to donate some data, and 6.5% (n= 26) were unwilling to donate no data after death (see Table 2; note for annual frequency of getting ill, none of my data is [n= 28] and some of my data [n= 341] differ due to a lesser number of responses to this demographic question). Among 399 participants indicating willingness to donate data by data type, most were willing to donate health data (electronic medical record data [67%], prescription history data [63%], genetic data [54%], and fitness tracker data [53%]) after death (see Figure 1). Few participants were willing to donate Snapchat data (18%), credit card statement data (19%), tax records and income history data (21%), ride-sharing history (22%), and Twitter data (23%) after death.

*Figure 1.* Participant willingness to donate data social media, health, direct communication, online browsing or streaming, financial, location, and voting history data after death (n= 399)



Across all responses to the demographic questionnaire (n=400, duration of using online medical websites; n= 396, age range; n= 398, annual frequency of getting ill; n= 400, education level), we evaluated the relationship between participants' willingness/unwillingness to donate data after death and each demographic variable. Among participants indicating willingness or unwillingness to donate data after death (n= 397), most participants (> 67%) were willing to

donate some of their data after death. Less than 22% of participants across all demographic categories/subcategories were unwilling to donate any of their data and <11% were willing to donate all of their data after death levels (see Table 2 and corresponding Figure 2). Interestingly, all (100%) of participants with an annual frequency of getting ill of 7 to 10 years were willing to donate some of their data after death, comparing to 80% of participants with an annual frequency of getting ill of 4 to 6 years.

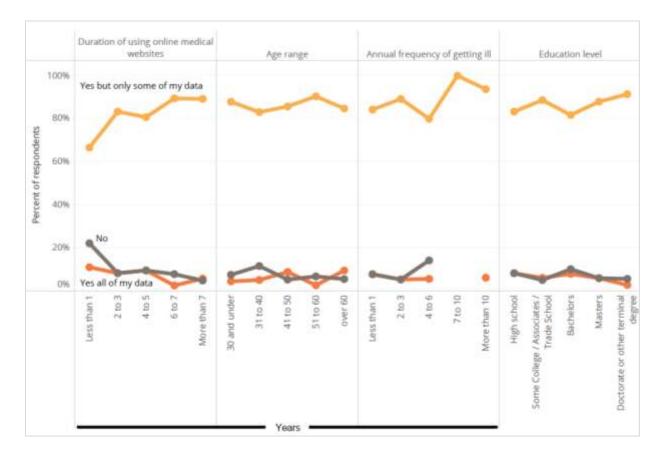
*Table 2.* Table summary of participants' willingness to donate none, some, or all data after death per reported duration of using online medical websites, age range, annual frequency of getting ill, and education level

Willingness to							
Donate Data	Duration of U	sing Online Med	lical Websites (Y	(ears), n= 369*			
After Death*							
	Less Than 1				More than 7		
	( <i>n</i> = <i>18</i> )	2 to 3 $(n=36)$	4 to 5 (n= 53)	6 to 7 $(n=38)$	( <i>n</i> = 224)		
None of my							
data (n= 29)	22%	8%	9%	8%	5%		
Some of my							
<i>data</i> ( <i>n</i> = 342)	67%	83%	79%	89%	89%		
All of my data							
( <i>n</i> = 26)	11%	8%	9%	3%	6%		
	Age Range (Y	Age Range (Years) n= 400					
	30 and under	31 to 40	41 to 50	51 to 60	Over 60		
	( <i>n</i> = 64)	( <i>n</i> = 78)	( <i>n</i> = 57)	( <i>n</i> = 71)	( <i>n</i> = 126)		
None of my							
data (n= 29)	8%	12%	5%	7%	6%		
Some of my							
<i>data</i> ( <i>n</i> = 342)	88%	82%	84%	90%	84%		
All of my data							
( <i>n</i> = 26)	5%	5%	9%	3%	10%		
	Annual Frequ	ency of Getting	Ill, n= 398	1	1		

	Less than 1				More than 10	
	( <i>n</i> = 193)	2 to 3 $(n = 149)$	4 to 6 (n= 35)	7 to 10 (n= 5)	( <i>n</i> = 16)	
None of my						
<i>data</i> ( <i>n</i> = 28)	8%	5%	14%	0%	0%	
Some of my						
<i>data</i> ( <i>n</i> = 341)	83%	89%	80%	100%	94%	
All of my data						
( <i>n</i> = 26)	8%	5%	6%	0%	6%	
	Education Level n= 400					
		Some College/			Doctorate or	
		Associates/			other terminal	
	High School	Trade School	Bachelors	Masters	degree	
	( <i>n</i> = 12)	( <i>n</i> = 98)	( <i>n</i> = <i>138</i> )	( <i>n</i> = 117)	( <i>n</i> = 35)	
None of my						
<i>data</i> ( <i>n</i> = 29)	8%	5%	10%	6%	6%	
Some of my						
<i>data</i> ( <i>n</i> = 342)	83%	88%	81%	87%	91%	
All of my data						
( <i>n</i> = 26)	8%	6%	8%	6%	3%	

\*Respondents who indicated "Unsure" for willingness to donate data after death (n= 3), and "Never" (n= 5) and "Unsure" (n= 26) for duration of using online medical websites are excluded from this table summary.

*Figure 2.* Graphical illustration of participants' willingness to donate none, some, or all data after death based on duration of using online medical websites (n = 400), age range (n = 400), annual frequency of getting ill (n = 398), and education level (n = 400)



We identified that individuals were more likely to donate some data after death (versus no data) if they had longer duration of using online medical websites (adjusted RRR = 1.22, p= 0.04, 95% Confidence Interval [CI]: 1.01 to 1.48 see Table 3). Among individuals willing to donate some data after death and had more than 2 years of using online medical websites, they were more likely to donate health data (electronic medical record data; prescription history data; genetic data, and fitness tracker data; supplement Table 1), similar to the overall participant population (Figure 1). No additional significant findings were observed between willingness to donate all, some, or no data and other demographic variables.

Demographic Category								
	Unadjusted RRR	95% CI	P value	Adjusted RRR	95% CI	P value		
Willingness to Don	Willingness to Donate <u>Some Data</u> (n= 342) versus No Data (n= 29)							
Age	1.14	0.88 to 1.46	0.32					
(n=400)				1.10	0.84 to 1.43	0.49		
Education level								
(n=400)	1.04	0.71 to 1.52	0.85	0.95	0.63 to 1.43	0.81		
Duration of using								
online medical								
websites (n= 400)	1.22*	1.02 to 1.47*	0.03*	1.22*	1.01 to 1.48*	0.04*		
Annual frequency								
of getting ill <sup>a</sup>								
(n= 398)	1.16	0.75 to 1.81	0.50	1.16	0.73 to 1.85	0.52		
Willingness to Donate <u>Some Data</u> (n= 342) versus All Data (n= 26)								
Age								
(n=400)	0.87	0.65 to 1.13	0.28	0.84	0.63 to 1.11	0.22		
Education level								
(n= 400)	1.15	0.77 to 1.72	0.50	1.14	0.76 to 1.72	0.53		

Table 3. Results from multinomial logistic regression assessing participants' willingness to donate data after death

Duration of using						
online medical						
websites						
(n=400)	1.11	0.91 to 1.37	0.31	1.13	0.91 to 1.41	0.26
Annual frequency						
of getting ill <sup>a</sup>						
(n= 398)	1.21	0.75 to 1.94	0.43	1.18	0.74 to 1.90	0.50
Willingness to Don	ate <u>All Data</u> (n= 26) ve	ersus No Data (n=	29)	L		
Age (n= 400)	1.33	0.92 to 1.91	0.13	1.31	0.90 to 1.92	0.16
Education level						
(n=400)	0.90	0.53 to 1.54	0.71	0.83	0.48 to 1.45	0.52
Duration of using						
online medical						
websites (n=400)	1.10	0.85 to 1.42	0.48	1.08	0.82 to 1.42	0.59
Annual frequency						
of getting ill <sup>a</sup>						
(n= 398)	0.96	0.51 to 1.80	0.91	0.99	0.52 to 1.87	0.96

\*significant ( $p \le 0.05$ )

<sup>a</sup>None of my data is n= 28 and some of my data is n= 341 due a lesser number of participant responses to this demographic question

CI: Confidence Interval

RRR: Relative Risk Ratio

## Discussion

This study is the first to explore a national sample of ResearchMatch participants' willingness to donate data after death with researchers. This is a timely exploration of adults' preferences to share data after death with health researchers who are working towards improvement in the standard of care, developing new or optimize current treatments with precision medicine applications, and/or building our generalizable knowledge about health and disease in the real world.

Tang et al. have defined 'online medical websites' as popular forms of public health service products that can "address patients' basic medical problems remotely and give health guidance online."<sup>21</sup> That is, online medical websites are a common and convenient source of authoritative health-related guidance in online environments. Our finding that individuals who increasingly participate in the use of online medical websites are significantly more willing to donate some data posthumously could therefore be related to the availability of on-demand, convenient, and perhaps trusted health education to internet users and resulting health literacy.<sup>22</sup>

Given our findings, we suggest that individuals engaging in online medical websites could be empowered with tools to communicate and (pre)specify which data they wish to donate and with whom after death. This is especially true and important to help navigate individuals' personal preferences to share data (or not share data/be forgotten without digital resurrection) after death amid complex privacy and tort laws, research enterprise regulations, and potential family and other surviving caretaker concerns and needs.<sup>23</sup> Further work might explore whether individuals within online communities might be more willing to donate data to health researchers once the individuals are deceased. Such studies might be useful for researchers who use online mechanisms to engage and educate individuals, prior to and during their engagement in health research, about how their data can be safely processed and/or used upon death during a study. Also, given that our study did not explore associations between the combined effects of duration of using online medical websites and sex/gender or racial/ethnic identity on willingness to share posthumous data, emerging evidence suggests that this research is warranted.<sup>24</sup>

Although little to no empirical studies have been published on the topic of posthumous data donation, our findings can be compared to a few. For instance, one recent patient survey study, conducted in an emergency room setting, found that most participants (65%; n= 160) expressed

willingness to share data from at least one digital data type listed in their survey after death.<sup>25</sup> This finding is consistent with our finding that most participants (>67%) across all demographic categories were willing to donate some of their data with researchers after death. This same study also found that over 70% of its participants were willing to donate prescription history, electronic medical record, wearables, genetic, and Facebook data.<sup>25</sup> Their findings largely concur with our present study findings, except we found that less than 50% of participants indicated willingness to donate Facebook data after death (see Figure 1). Therefore, future work might explore the potential impact of surveys conducted among patients or participants within emergency room settings versus online settings to evaluate willingness to donate data after death.

Research and commentary are emerging with discussions on posthumous data donation for secondary research purposes and data use consent strategies. This includes but is not limited to work describing meta-consent versus potentially controversial uses of broad consent, use of data without consent when considered ethically or morally permissible, and 'contextual exceptionalism' that would require evaluating uses of data from deceased individuals on a case-by-case basis by research ethics committees.<sup>26–28</sup> Such work can be useful for practicing researchers and research oversight boards to identify or develop best practices and consent tools, especially in cases where post-mortem data privacy laws might be either nonexistent or vague in covering a wide range of data sources used for research purposes.

For example, commentary highlighting consent models that protect the interests of data subjects, giving them opportunities to expressly opt-out of or opt-in to research using their data upon their death, are useful to develop checklists, forms, and other working documents to support the practice of protecting the interests and autonomy of data subjects. Meta-consent is one such consent model highlighted as a potentially useful alternative in practice to broad consent, a more controversial alternative, for data use after death.<sup>26</sup> That is, the practice of meta-consent provides data subjects with opportunities to indicate or design how, when, and whether they would like to be approached for data use consent. Under the meta-consent model, individuals could specify research terms, conditions, and contexts (i.e., donation of some, all or no data from one or more data sources to evaluate specific research questions) in which they would consent to the posthumous use, nonuse, or deletion of their personal data.

One recent study that surveyed 100 nonfederal acute care hospital websites to explore whether their privacy policies accurately disclose their use of third-party tracking technologies.<sup>29</sup> The study found that 96.0% of hospital websites had at least one third-party data request and 86.0% had at least one third-party cookie (n= 100); although, among the 71 accessible privacy policies found only 40 (56.3%) specifically named third-party companies receiving user data.<sup>29</sup> Therefore, our study, among others, indicates that there are opportunities for health systems, medical journal publishers, and others to determine best practices to safely, creatively, accessibly, and purposefully engage patients in health systems' online medical websites for educational purposes.<sup>30–33</sup> Doing so might encourage or inspire individuals to expressly engage in posthumous data donate for health research purposes.

For instance, online medical websites could be developed in ways that might address popular and/or identified reasons for health information seeking behaviors among demographically and geographically diverse populations (i.e., private self-screening, caregiving, learning about clinical trials, creating and/or sharing new information for others, etc.).<sup>33–35</sup> Owners of websites with moderate to high user activity, or website owners seeking to build towards moderate to high activity, might do so with our present findings in mind. That is, to explore opportunities to develop or embed tools that help prospective study participants connect with researchers and/or opt-in to receiving notifications about opportunities to participate in data-driven research.

Our study is accompanied by general limitations, some of which have been mentioned in our prior publications.<sup>17,18</sup> For instance, our study sample was derived from ResearchMatch, a platform that uses a meta-consent model to directly reach and engage a population that is likely inclined to engage in data sharing for research. Future work should explore the validity of our key findings among other representative samples of the US population. Also, given that none of our survey respondents with an annual frequency of getting ill at 7 to 10 indicated a willingness to share neither all or none of their data after death, further work could explore this particular sub-demographic to either confirm or gather further qualitative context around this finding.

Lastly, our survey allowed participants to indicate their willingness to share 'Genetic data (23andMe, etc.)' without specifically indicating whether that entails DNA sequencing results, health, and/or ancestry information. Future work should explore this in greater detail to assess individuals' willingness to share certain forms or interpretations of their genetic data as well as

their relevant data privacy or use consent concerns, if any, concerning themselves and/or their relatives (biological or nonbiological).

#### Conclusion

Navigating the procedurally complex landscape of post-mortem data privacy and within the datadriven health research landscape warrants the need to explore patterns in individuals' willingness to donate data with health researchers after death and development of practical recommendations. Our study shows that not only are individuals likely willing to donate health data after death; people are more likely to donate some data after death as they have greater years of using online medical websites. Therefore, our study provides useful insights into how a nationally representative sample of ResearchMatch participants are willing to donate data after death with researchers, which is one route to help guide this complex landscape. Likewise, our findings are useful to those exploring opportunities and strategies to safely and meaningfully engage individuals with online health information seeking behaviors in data-driven health research, both actively and posthumously.

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