Article 2: Information-Seeking Behavior Decision-Making between Online Search and Interpersonal Networks: The Case of Covid-19

Vaccinations

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1 Abstract

How do individuals perform information search, and what factors help them decide which information search vehicle to utilize, such as interpersonal networks or online tools, I investigate the above question using individual survey data of 934 Adults in the United States and find that X and Y. Furthermore, this paper demonstrates that searching for a question online using a search engine or social network was more common than traditional means of information gathering, such as network activation (asking someone in their social network for informational support). Using X and Y theory I predict that that few people will activate their social network for informational support in my chosen case of Covid-19 vaccinations because of the social cost of doing so but fail to find evidence for this thesis. I also investigate which information channels are associated with vaccinations against the virus, and find that social netwokring sites are associated with lower rates. I also find important ethnocracial differences in information search vehicles utilization and vaccination reception.

Previous research has greatly failed to distinguish between the activation of information seeking behaviors online and offline. In this paper, I aim to uncover just how different various methods of information search are and begin a line of research inquiry that investigates the factors associated with each vehicle. Finally, I also aimed to uncover how the different fountains of information and information search vehicles hold real world consequences through their associations with Covid-19 vaccination rates and intentions.

2 Intro

It is unclear how individuals choose to search for information through the multimedia environment of the 21st century. Much of the research conducted in social networks and communication focus on senders, influencers, and persuasion strategies (Merton 1968) rather than on "the receiver as an active information seeker and processor." (Johnson and Meischke 1993).

Core discussion networks are the default lens to investigate network resources and social support in surveys. The underlying assumption is that individuals reach out to a handful of strong ties when in need of support, which can be elicited in surveys using name generators (Marsden 1987). This approach has yielded important insights, but largely overlooks crucial processes of resource activation (Hurlbert, Haines, and Beggs 2000; Perry and Pescosolido 2015; Smith 2005). Small (2017) shows that the core discussion network does not capture how people activate social support in practice and indicates that people draw on much broader social connections for support, also calling back to the weak ties research by Granovetter (1973). There is ongoing research investigating how weak-tie support holds for different support types based

on the architecture put forward by House, Umberson, and Landis (1988) of instrumental, emotional, and informational support. I follow the definition of Cohen and Wills (1985) and define informational support as "help in defining, understanding, and coping with problematic events and include education, advice, or referral to another source of support" (Winemiller et al. 1993:640).

However, informational support can also be sought outside of the social network context, namely via computer-mediated information search tools such as the process of "Googling." As the online environment began penetrating all facets of modern human life, it makes sense that performing online search has become one of the most convenient vehicles for information search. While Small (2017) focuses on how support can depend on a network tie simply "happened to be there," online search is theoretically the most frictionless and costless mode of support. There are three computer-mediated vehicles I consider for this analysis: search engines like Google, posting questions on online forums like subreddits or Facebook groups, and posting a status update online via Facebook or Twitter. The first two comprise what I call "online search," while the third is conceptually distinct and important to include in the survey; yet, it is a hybrid of social network activation and online search.

As online search or interaction also allows increased anonymity, no or lowered social cost, and the potential avoidance of embarrassment and other negative social interactions, I theorize that a majority of people who searched for information will have done so online.

For this paper, I will use the case of Covid-19 vaccinations to explore the variation among information search vehicles. There are theoretical reasons why individuals would choose to search for information among their network ties instead of online search. For instance, Rains (2018) finds that patients tend to search for technical information about an illness online but turn to their social network for experiential information from others facing similar circumstances in the case of cancer. Moreover, if an individual distrusts the medical establishment, or popular media, they may be more likely to activate informational support among their social network or turn to online groups that validate their worldview (Bogers and Wernersen 2014).

This research project is important because the vehicles used to search by people impacts the information they are exposed to. Given the large swaths of both misinformation and disinformation regarding Covid-19 (Motta, Stecula, and Farhart 2020; Pathak, Agarawalla, and Gupta 2020; Shahsavari et al. 2020) and the measurable impacts this misinformation has had on pandemic-related health behaviors, how we choose to search for information affects our own lives and the lives of others. Moreover, individuals who do not utilize social networks for information search may feel like they have no network support, leading to feelings of network isolation with major implications for mental health (Thoits 2011)

Research Questions

- How do computer-mediated or interpersonal network information-seeking strategies vary across populations?
- What factors lead people to perform health information search online versus among social network ties?
- How does the utilization of social networks, search engines, and social media as vary in the case of searching for information on the Covid-19 vaccine?

3 Research Methodology

The data used for this research project are based on original survey data sampled between December 03, 2021 through December 12, 2021. This survey was hosted on Qualtrics and participants were paid and recruited using Amazon Turk (MTurk). The total valid survey responses (n = 948) were selected from a total of 1,066 respondents; some responses were disqualified due to a few factors such as detected usage of a VPN, random answer clicking (determined by illogical responses), poor quality typed responses (e.g. social network alters consistently named random nouns), or taking the survey more than once. The same is slighted gender unbalanced, slightly skewing towards a male sample. For the respondents who provided their zipcode (p = 0.98), the sample is quite balanced with a slight skew towards MTurkers in the South (p = 0.41). The survey took an average of 24.48 minutes with a standard deviation of 13.23 minutes. The shortest valid survey took 3.75 minutes and the longest took 111.08 minutes. Participants were paid \$6.00 for their time after Amazon administrative fees, funded by a Grant awarded to Kelsey E. Gonzalez and Nicolas Legewie by the Summer Institute in Computational Social Science and the Russell Sage Foundation. The main portion of this survey replicates the book, Someone to Talk To (Small 2017) by expanding Small's finding that people draw on much broader sources than "important people" for support by segregating weak-tie social support into instrumental, emotional, and informational support (see House et al. 1988)). The latter part of the survey focuses on resource activation for the specific case-study of information during the Covid-19 pandemic and is analyzed in this paper.

3.1 Measures

3.1.1 Sought Information

There are multiple dependent variables of interest for this paper. The first variable is a dichotomous indicator of whether someone intentionally sought out information about Covid-19 vaccinations. The survey asked, "And how about you yourself intentionally looking for information about a Covid-19 vaccine? Such

Table 1: Descriptive Statistics for Dichotomous and Numeric Variables

	Mean	SD
Received info	0.66	0.47
Received info, Doctor	0.47	0.50
Received info, Person	0.67	0.47
Received info, News	0.65	0.48
Received info, Social Networking Site	0.40	0.49
Received info, Online Forum	0.35	0.48
Sought Info	0.78	0.41
Sought Info, Doctor	0.44	0.50
Sought Info, Person	0.42	0.49
Sought Info, Social Networking Site	0.18	0.39
Sought Info, Online Forum	0.27	0.44
Sought Info, Online Search	0.41	0.49
Vaccination Status	0.84	0.36
Vaccination Favorability	0.87	0.34
Age	37.76	10.75
Hispanic or Latino/x	0.15	0.36
Race, Black	0.88	0.33
Race, Black	0.08	0.27
Race, Native American	0.03	0.16
Race, Asian or Pacific Islander	0.04	0.20
Associate's Deg or above	0.74	0.44

Notes: 948 Surveyed, Conducted December 03 through December 12, 2021.

information can include things such as advice, clarification, facts, and experiences." About 78% (\hat{p}) of respondents had intentionally sought out information about Covid-19 vaccinations (95% Confidence Interval = $\{0.76, 0.81\}$).

Further dependent variables segment the above question into multiple options; "How did you look for information about the Covid-19 vaccine?" Respondents were posed with 5 responses and 'other,' of which they could select multiple. The largest proportion, 44%, asked their 'doctor or another health professional' (95% Confidence Interval = {0.41, 0.47}). About 42% said they asked 'a person like friend, neighbor, or family member that [they] know' (95% Confidence Interval = {0.39, 0.45}). An additional 41% searched 'for [their] question using an online search engine such as Google or Bing' (95% Confidence Interval = {0.38, 0.45}). About a quarter of the sample, 27%, 'posted queries in an online discussion group, listserve, or other online forum like a Facebook Group or Subreddit' (95% Confidence Interval = {0.24, 0.3}). And finally, 18% of the sample 'posted queries on a social networking site such as Facebook timeline, Twitter status update, or Linkedin' (95% Confidence Interval = {0.16, 0.21}). Much of the question wording and the specific categories of search were inspired by ICPSR project 37220 (Scanlon 2019).

Table 2: Descriptive Statistics for Categorical Variables

		N	Percent
Gender	Female	418	44.09
	Male	524	55.27
	Other	6	0.63
Highest Education Level	Graduate or professional degree	145	15.30
	Bachelor's degree	560	59.07
	Associate's or Technical degree	72	7.59
	Some college	100	10.55
	High school graduate	68	7.17
	Less than high school	3	0.32
Plan to be Vaccinated if not	Probably not	38	4.01
	Definitely yes	13	1.37
	Definitely not	61	6.43
	Might or might not	22	2.32
	Probably yes	13	1.37
Found Info Sought Useful	Very useful	345	36.39
	Moderately useful	112	11.81
	Extremely useful	264	27.85
	Slightly useful	18	1.90
	Not at all useful	2	0.21
Census Region	Midwest	171	18.04
	Northeast	170	17.93
	South	365	38.50
	West	223	23.52

Notes: 948 Surveyed, Conducted December 03 through December 12, 2021.

3.1.2 Vaccination Outlook

Another Dependent variable for this analysis is a dichotomous variable indicating whether the respondent has received a vaccination against Covid-19 or plans to. For this survey, the number of doses were unimportant and actually having already received the dose were irrelevant to the research question. This variable instead focuses on intent or opinion about the vaccine. About 87% have a positive view about the vaccine. This construct is made through the combination of two survey items. The first item is actual vaccination status, obtained through the question 'Did you receive a Covid-19 vaccine?' 84% of the sample said that they had indeed received a vaccination (95% Confidence Interval = $\{0.82, 0.87\}$). As the national vaccination rate is closer to 55% (CITE), this indicates some bias in our sample that must be acknowledged: either MTurkers are more likely to be vaccinated that the normal population (sampling bias) or there is some conformity bias in the responses causing survey takers to provide false answers. The second survey item that contributes to 'Vaccination Outlook' was only given to those who had not responded 'yes' to the to their vaccination status. These respondents were asked 'Do you plan to receive a vaccine for the prevention of the Covid-19 virus?' Of those who were asked this question (n = 147), 9% said they were 'definitely yes' getting the vaccine; 9%

said they were 'probably yes' going to receive vaccine. The rest of the sample was more unsure: 15% said they 'Might or might not,' 26% said 'Probably not,' and finally 41% said they would 'definitely not' receive the vaccine. The variable 'Vaccination Outlook' indicates their either the respondent received a Covid-19 vaccine or either probably or definitely will in the future.

3.1.3 Independent Variables

The first independent variables used in this analysis are based on the question, 'In the past 12 months, without searching for it, did you receive information about the Covid-19 vaccine from ... (check all sources you received information from).' This differs from the 'How did you look for information' question above because it is based on passive reception of information. The largest proportion of respondents had received information from a person like friend, neighbor, or family member that [they] know ($\hat{p} = 67\%$). Respondents also commonly received information from a television news channel or a newspaper, about 65% of the sample. 47% of the sample had received information from their doctor or other health professional while 40% received information from a social networking site such as Facebook timeline, Twitter status update, or linkedin. Finally, the lowest proportion of the sample had received information from an online discussion group, listserve, or other online forum like a Facebook group or subreddit ($\hat{p} = 35\%$).

We also asked various demographic questions to understand our sample. The average age of our sample was 37.76. Our sample was 44% female, and 55% male. The sample is diverse racially though some ethnic groups are under represented compared to national averages. Race was evaluated using the question, 'What is your race? If you are "mixed race," select all that apply.' Because of the multi-selection question, each variable is dichotomous and proportions are shown. 88% of the sample claimed they were 'White,' 8% claimed to be 'Black or African American,' 3% chose 'American Indian or Alaskan Native,' 4% selected 'Asian,' and finally when asked 'Are you Hispanic, Latino/a/x, or Latin American Origin; 15% selected 'Yes.' Respondents were also asked to select the highest level of education that you have completed. Based on the breakdown between 'Less than high school,' 'High school graduate,' 'Some college,' 'Associate's or Technical degree,' 'Bachelor's degree,' and 'Graduate or professional degree,' 74% of the sample were classified to have a College-level education (Associate's degree or above).

4 Analysis

My analytic strategy proceeds in four steps. In Tables 1 & 2, I present descriptive statistics for all study variables, including variable ranges, means, and standard deviations. For this paper, I rely heavily on logistic regression, modeled in **r**; specifically, I fit a series of Binomial Generalized Linear Models (Venables and

Ripley 2002). In Table 3¹, I fit a logistic regression model predicting whether someone sought information about Covid-19 using their sources of information ('Received info') as well as various demographic variables such as age, education level and race. Figure 1 then illustrates the relationship between the coefficients and information seeking.². In Table 4 I disaggregate information seeking behaviors by investigating the difference in proportions of each of the 5 different avenues of seeking information about Covid-19: from another person, from a doctor, on an online forum, on a social networking site, or using an online search tool. I investigate these differences through a phi coefficient (Warrens 2008), otherwise known as a mean square contingency coefficient which is used to investigate the degree of association between two binary variables.³ I then investigate the associations between my predictors and the 5 information search vehicles by modelling a series of logistic regressions in Table 5. Finally, in Table 6, I investigate whether there is a relationship between information receiving and information seeking behaviors and the choice to get vaccinated against Covid-19 through a logistic regression model predicting Vaccination Outlook. Figure 2 then illustrates the relationship between the coefficients and vaccination outlook.

5 Results

5.1 Information Seeking

Table 3 provides the results of my logistic regression analysis predicting whether someone sought information about Covid-19. These initial results suggest similar results for each vehicle of information delivery: each mode of receiving information whether from a doctor, a person, the news, a social networking site, or an online forum, all increase the odds of seeking out information. For example, respondents who had received information from a doctor or other medical professional were 2.82 (relative odds ratio = $exp(\beta k)$, p < 0.001) times more likely to seek out information over someone who hadn't. Similarly, respondents who had received information from 'a person like friend, neighbor, or family member that [they] know' were 1.87 (p < 0.001) times more likely to seek out information over someone who hadn't received information from a person like that. Interesting, those who had received information from an online discussion group, listserve, or other online forum including a Facebook group or subreddit were 2.39 (p < 0.001) times more likely to search out more information than someone who hadn't. While most demographic variables don't seem to have a strong effect on whether someone sought out information about the Covid-19 vaccine, a few key variables had strong associations. Age, for instance, is associated with seeking information; every additional year of

 $^{^1}$ All tables in this paper were created with the model summary package in ${\tt r}$ (Arel-Bundock 2022)

²Figures in this paper were all created using the r packages jtools (Long 2020) and ggplot2 (Wickham 2011; Wickham, Chang, and Henry n.d.)

³To calculate the Phi Coefficient, I utilize the Psych r package (Revelle 2015)

Table 3: What predicts someone intentionally searched for information

	Model 1
Received Info, Doctor	1.037*** (0.181)
Received Info, Person	0.624*** (0.171)
Received Info, News	0.316+(0.175)
Received Info, Social Networking Site	0.320+(0.187)
Received Info, Online Forum	0.873**** (0.203)
Age	0.025**(0.009)
Associate's Deg or above	0.456*(0.192)
White	0.857 (0.575)
Black	1.274*(0.625)
Native American	0.405 (0.710)
Asian	$0.105 \ (0.588)$
Hispanic or Latino/x	$0.425 \ (0.271)$
Num.Obs.	948
$R_{McFadden}^2$	0.110
BIC	988.1
Log.Lik.	-442.618
F	6.183

Raw, Unexponentiated Coefficients

age a person holds they are 3% more likely to search for information, possibly indicating a generational effect of information seeking patterns (p < 0.01). Additionally, those who were more educated, that is those with an associate's degree or higher, were 1.58 more likely to seek additional information than those without the degree (p < 0.05). And finally, there is evidence to suggest that the Black or African American sample was more likely to seek out information, specifically: Blacks were 3.58 times more likely to seek out information over non-Blacks (p < 0.05). Figure 1 illustrates the relationship between the coefficients and information seeking.

5.2 Information Search Vehicles

Table 4: Phi Coefficient (ϕ) of binary association between each Information Search Vehicle

	Person	Dr	Online Forum	Social Networking Site	Online Search
Person	NA	0.28	0.172	0.275	0.216
Dr	NA	NA	0.192	0.152	0.098
Online Forum	NA	NA	NA	0.371	-0.073
Social Networking Site	NA	NA	NA	NA	0.057
Online Search	NA	NA	NA	NA	NA

To further investigate how people search for information, I asked those who had sought information out intentionally, "How did you look for information about the Covid-19 vaccine?" Because respondents could

^{*} p < .05. ** p < .01. *** p < .001 (two-tailed test).

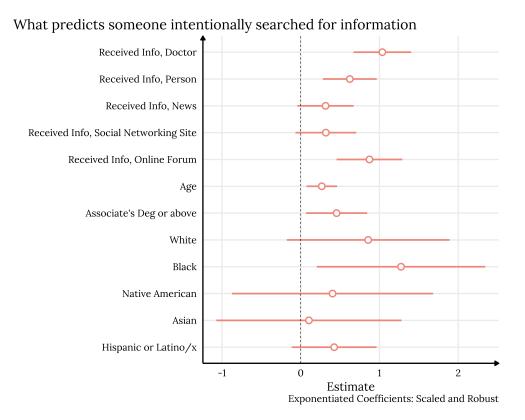


Figure 1: Plot of Coefficients, Model 1

select as many responses as applicable, each response is recorded as a dichotomous variable. I first investigate how each Information Search Vehicle are related to each other using the Phi Coefficient (

phi) of binary association between each Information Search Vehicle pair. The Phi coefficient can be interpreted like a correlation coefficient, with numbers closer to -1 or positive one indicating a very strong relationship (Warrens 2008). Table ?? shows the results of these coefficients. Out of the five information search vehicles investigated, there is evidence that the vehicles are distinctly different concepts because most coefficients fall under 0.3, the general rule of thumb for correlation coefficients to indicate a relationship. There does seem to be a relationship between Online Forums and Social Networking Sites, possibly due to an individual's propensity to use online networks over in-person networks. These coefficients indicate a weak relationship between any two vehicles of information search and and that respondents in my sample utilize each of these a little bit differently.

Results of each logistic regression are displayed in Table 5. Modeling each response as a separate formula is useful for interpretation, but there are important caveats: because each logistic regression is on a different scale, one must not compare the magnitude of coefficients between models. We can, however, use the direction and significance of the coefficients to draw conclusions about these different forms of information

Table 5: What predicts someone intentionally searched for information, by vehicle of information search

	Dependent Variable				
	Doctor	Person	Online Forum	Social Networking Site	Online Search
Received Info, Doctor	1.942***	1.124***	0.181	0.540**	0.430**
Received Info, Person	0.800***	1.199***	0.728***	0.281	0.365*
Received Info, News	0.437**	0.100	0.359*	0.514*	1.091***
Received Info, Social Networking Site	-0.130	0.437**	-0.603**	0.731***	1.272***
Received Info, Online Forum	0.412*	0.263 +	1.266***	0.974***	0.695***
Age	0.002	0.001	-0.007	-0.003	0.029***
Associate's Deg or above	0.542**	0.154	1.086***	1.344***	-0.952***
White	0.631	0.245	0.009	0.559	0.012
Black	0.366	0.208	0.608	0.646	0.357
Native American	0.309	-0.696	0.209	0.762	-0.831
Asian	-0.294	-0.566	-2.496**	-0.568	0.634
Hispanic or Latino/x	0.324	0.116	0.529*	0.632**	-0.585*
Num.Obs.	948	948	948	948	948
$R^2_{McFadden}$	0.193	0.121	0.145	0.154	0.221
BIC	1152.2	1237.6	1048.0	864.8	1104.6
Log.Lik.	-524.709	-567.376	-472.576	-380.971	-500.907
F	13.742	9.194	8.497	7.879	14.319

Raw, Unexponentiated Coefficients

search vehicles.

The first model in Table 5 predicts whether or not a respondent sought information intentionally about Covid-19 vaccinations by asking their doctor or another health professional. First and foremost, I find that those who received information about Covid-19 vaccinations were 6.97 times more likely to seek out more information from their doctor than those who had not (p < 0.001). However, receiving information from other vehicles also increased the odds of seeking out information from medical professions. Those who received information from a person like a friend or a relative were 2.23 times more likely to ask their doctor (p < 0.001), while those who received information from the news or television were 1.55 times more likely (p < 0.01). I also find that those who received information from an online forum like a subreddit were 51% more likely to ask their doctors than those who hadn't (p < 0.05). Finally, respondents with an associate's degree or higher were 72% more likely to ask their doctor for information on the Covid-19 vaccinations than those who held less education (p < 0.01).

The second model predicts whether or not a respondent sought information about Covid-19 vaccinations by asking a person like friend, neighbor, or family member that they know. Only three coefficients in this model were significant and help us draw any conclusions on who is most likely to activate their personal social network for informational support. In this study, I find that receiving information about the vaccine from a doctor, their personal network, or a social networking site is associated with seeking out more information. Those who received information from a doctor or other medical professional were 3.08 times more likely to

^{*} p < .05. ** p < .01. *** p < .001 (two-tailed test).

seek information from a person like a friend (p < 0.001). Moreover, it seems that receiving information from your personal social network, like a friend or relative, is associated with seeking information from those same people; in fact, I find that those who did are 3.32 more likely to do so (p < 0.001). Finally, the respondents who received information about the vaccine on a social networking site were 55% more likely to seek information from their personal network than those who hadn't (p < 0.01). The unexpected result of this model is that very few factors predict personal social network activation and this model has the lowest McFadden's R^2, indicating possible omitted variables.

I also wanted to see what was associated with posting in an online discussion group, listserve, or other online forum like a Facebook Group or Subreddit about Covid-19 vaccinations. This is conceptually different that posting a query on a social networking site like Facebook or twitter where identities are involved, but is theoretically more [costly?][friction?] than searching on an internet search engine. I found that having received information about the vaccine from your personal social network (like a friend or relative), the news, or an online forum was associated with higher odds of querying an online forum. Specifically, receiving information from your personal network is associated with 2.07 higher odds (p < 0.001), from news or television media with 1.43 higher odds (p < 0.05), and receiving information on an online forum associated with 3.55 higher odds (p < 0.001). Moreover, I found that those with an associate's degree or above were 2.96 times more likely to search for information on an online forum (p < 0.001). Finally, I found a racial-ethnic with Hispanic-Latinos; I found that they were about 70% more likely to query an online forum than non-Hispanics (p < 0.05). However, there were also a few variables that lowered the odds of posting in an online discussion group. First, those who had received information from a social networking site were 45% less likely to query a forum than those who hadn't (relative odds ratio = $1 - exp(\beta k)$, p <0.01). Morever, I find more ethno-racial effects: Respondents who claimed Asian ancestry were 92% less likely to query online forum (p < 0.01).

The fourth model predicts whether an individual sought information about Covid-19 vaccinations through posted queries on a social networking site such as Facebook timeline, Twitter status update, or Linkedin. Receiving information about Covid-19 seems to be quite related to posting on social media. Those who received information from their doctor's had 1.72 higher odds of posting on a social networking site (p < 0.01), while those who received their information from tv/news had 1.67 higher odds (p < 0.05). Furthermore, those who received information on social networking sites were more likely to post queries on social networking sites ($\beta = 2.08$, p < 0.001). The respondents in our sample who received information on online forums had 2.65 higher odds of posting queries on their social networking platforms (p < 0.001). I found a relationship between education and posting on social networking sites as well; specifically, those with an Associate's degree or above were 3.83 times more likely to post vaccination queries on social networking

sites than those with lower education (p < 0.001). Finally, I find that Hispanic-Latinos were 88% more likely to ask their connections on a social networking site about the Covid-19 vaccinations than non-Hispanics (p < 0.01).

Searching for information using an online search engine such as Google or Bing is theorically the search vehicle with the least amount of social or cognitive friction. Our descriptive statistics showed that not everyone used this vehicle, with only 41% of our sample (See Table 1) having sought information about the Covid-19 vaccines using online search engines. My model reveals interesting patterns to help explain the variation. As with previous models, receiving information of any kind increase the odds of online search, though to varying magnitudes (Doctor: 1.54 odds; Person: 1.44 odds; News or Television: 2.98 odds; Social Networking Site: 3.57 odds; Online Forum: 2 odds). I also find that older respondents were more likely to search online, with each addition year aged to yield 3% higher odds of searching online (p < 0.001). The most interesting variations come from what decreases the odds of online search. First, those with an Associate's degree or higher were 61% less likely to search online for questions about Covid-19 than those with less educational attainment (p < 0.001). In addition, I find that Hispanic-Latinos had 44% lower odds of searching online than non-Hispanics (p < 0.005).

5.3 Vaccination Views

Finally, in Table 6, I investigate whether there is a relationship between information receiving and information seeking behaviors and the choice to get vaccinated against Covid-19 through a logistic regression model predicting Vaccination Outlook. I find that receiving information from a doctor or other medical profession is associated with 2.85 odds of receiving a Covid-19 vaccinated (p < 0.001) and that seeking information from a doctor also increases the odds of vaccination by 4 (p < 0.001). I find that my respondents who received information on a social networking site like Facebook or Twitter about the vaccines were 55% less likely to get vaccinated than those who received no information through that vehicle (p < 0.001). However, I did find that those who reached out to family or friends with their concerns were 77% more likely to become vaccinated (p < 0.05). Furthermore, my respondents who held an Associate's degree or above had 3.6 higher odds of becoming immunized (p < 0.001). And finally, I found further ethno-racial differences in my sample. I found that Hispanic-Latinos had 2.83 higher odds of vaccination than non-Hispanics (p < 0.05) and that my Asian sample had 4.73 higher odds as well over non-Asians (p = 0.09). See Figure 2 for a visual representation of how these different coefficients are related to vaccination outlook.

Table 6: Does receiving or searching for information predict vaccination status?

	Model 1
Received Info, Doctor	1.049*** (0.301)
Received Info, Person	$-0.206\ (0.242)$
Received Info, News	$0.108 \; (0.247)$
Received Info, Social Networking Site	-0.794****(0.240)
Received Info, Online Forum	$-0.321 \ (0.248)$
Sought Info, Doctor	1.386*** (0.341)
Sought Info, Person	0.570*(0.285)
Sought Info, Social Networking Site	$0.710 \ (0.466)$
Sought Info, Online Forum	$0.354 \ (0.342)$
Sought Info, Online Search	$0.085 \ (0.260)$
Age	-0.018+(0.011)
Associate's Deg or above	1.281****(0.234)
White	1.122(0.767)
Black	0.808 (0.799)
Native American	$0.126 \ (0.829)$
Asian	1.555+(0.918)
Hispanic or Latino/x	1.039*(0.505)
Num.Obs.	936
$R^2_{McFadden}$	0.261
BIC	669.2
Log.Lik.	-266.187
F	6.348

Raw, Unexponentiated Coefficients

6 Discussion

Previous research in Sociology and Infodemiology has greatly failed to distinguish between the activation of information seeking behaviors online and offline. In this paper, I aim to uncover just how different various methods of information search are and begin a line of research inquiry that investigates the factors associated with each different vehicle. Finally, I also aimed to uncover how the different fountains of information and information search vehicles hold real world consequences through their associations with Covid-19 vaccination rates and intentions.

I first find that receiving information about Covid-19 vaccinations from any outlined source increases the likelihood of searching out more information. I also find important demographic differences in the overall propensity to seek out information. First, I find that the older a respondent is, the more likely they are to seek out information about Covid-19 vaccinations, possibly indicating [???? TODO]. Furthermore, I find that those who are more educated, that is my respondents who hold an Associate's degree or higher were more likely to seek out information; for the most part this trend can be observed in Table 5 as well. Human Capital Theory (Mirowsky and Ross 1998) may help to explain this finding; this theory claims that

^{*} p < .05. ** p < .01. *** p < .001 (two-tailed test).

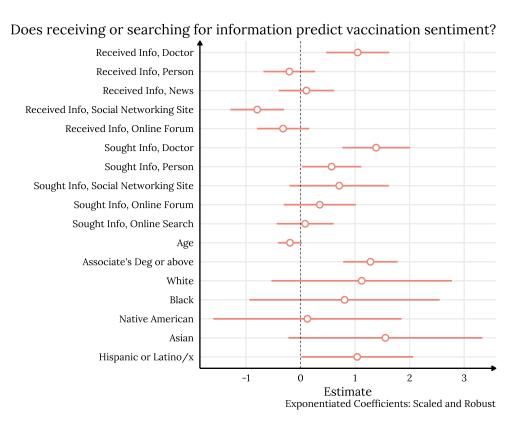


Figure 2: Plot of Coefficients, Model 3

education helps individuals gaining health-related knowledge and use this knowledge to be proactive in their own lives. Finally, I find that my respondents who identified as Black were more likely to seek out further information; this may be explained by the maltreatment that African-Americans have endured in the US healthcare system (Bailey et al. 2017) which has led to major distrust of the medical establishment among the population (Center 2019; Murray 2015).

(May need to cite (Bronson and Nuriddin 2014) above or elsewhere) table 2 main findings

usage of different information search vehicles varies by demographics and also reception of different ifnromation - overall, receiving information about Covid-19 vaccination generally spurs information seeking behaviors, though there are variations - receive info from doctor leads to searching info from doctor, likely indicates good communication and trust in doctor, solid relationship with healthcare professionals - few things predict seeking out information from another person, personal networks are so embedded in everyday life so perhaps don't remember doing it or behavioral prediction is notoriously hard - Received Info, Social Networking Site negatively predicts Online Forum, indicating that if your social networks fulfill your need for information you don't need to extend out to online forums to ask for things, need is already met? -

Asians are really unlikely to use online forums to find information in this context, very strong association but hispanics are more likely than non-hispanics to search online - online search is much less likely from those with higher education, which is counter intuitive since they are the population that has been the most trained in research methods and critical thinking .. perhaps they trust the information that they hear if they consider it to be a trusted source (typical higher education format of trust the professor) so they don't look deeper into it? basically already have high social capital in other ways, already set up to receive the information they needed and trusted - older populations are more likely to 'just google it'

takeaways: Not everyone is activating their personal social networks or using Google in the same rates, the internal variation of users is important to consider when using something like Google Trends education really affects information seeking behavior ethno-racial differences affect information seeking behavior, more research should look into why there are group differences (likely cultural)

Takeaway 2: in person, online, or search engines?

table 3 main findings - very important for getting people to get vaccinated - a major goal for public Health authorities over the last two years - extremely important given misinformation around vaccinations - receiving information from a doctor or other medical profession (or seeking) leads to more positive opinions. action inspired by this - difficult because of lack of primary care doctors for many americans, but every doctor should discuss the importance for every patient they interact with - receiving information from a social networking site NOT an online for results in less vaccinations. - differences in education level and race; seen in prior literature however most current literature claims that anti-vacination attitudes span social class, political ideology, and X.

social netwokring site info from doctor

rather than on "the receiver as an active information seeker and processor." (Johnson and Meischke 1993).

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7 Conclusion

Previous research has greatly failed to distinguish between the activation of information seeking behaviors online and offline. In this paper, I aim to uncover just how different various methods of information search are and begin a line of research inquiry that investigates the factors associated with each vehicle. Finally, I also aimed to uncover how the different fountains of information and information search vehicles hold real world consequences through their associations with Covid-19 vaccination rates and intentions.

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8 Appendix 1: Survey Questions

Q181: Now, we're going to transition a bit to ask you about the information you received during the
Covid-19 pandemic.
Q170: In the past 12 months, without searching for it, did you receive information about the Covid-19
vaccine from (check all sources you received information from)
• your doctor or other health professional? (1)
• a person like friend, neighbor, or family member that you know? (9)
• From television news channel or the newspaper? (10)
• From an online discussion group, listserve, or other online forum including a Facebook group or sub-reddit? (11)
 From a social networking site such as Facebook timeline, Twitter status update, or linkedin? (12) Other (13)
Q171: And how about you yourself intentionally looking for information about a Covid-19 vaccine? Such information can include things such as advice, clarification, facts, and experiences.
• Yes (4)
• No (5)
Q172: How did you look for information about the Covid-19 vaccine?
• Asking a person like friend, neighbor, or family member that I know (1)
• Asking my doctor or another health professional (4)
• Posted queries in an online discussion group, listserve, or other online forum like a Facebook Group of Subreddit (5)
• Posted queries on a social networking site such as Facebook timeline, Twitter status update, or Linkedin

• Searched for my question using an online search engine such as Google or Bing (7)

(6)

• Other (8)	
Q173: What sort of information did you search for? Separate different topics with a comma or semi-color	n.
Q174: How useful was the information you found?	
• Extremely useful (22)	
• Very useful (23)	
• Moderately useful (24)	
• Slightly useful (25)	
• Not at all useful (26)	
Q175: Did the information you learned affect your decision to get vaccinated against Covid-19?	
• Yes (39)	
• No (40)	
Q179: Did you receive a Covid-19 vaccine?	
• Yes (9)	
• No (10)	
• I'm unsure or would not like to respond (11)	
Q180: Do you plan to receive a vaccine for the prevention of the Covid-19 virus?	
• Definitely not (9)	
• Probably not (10)	
• Might or might not (11)	
• Probably yes (12)	

• Definitely yes (13)

• I would not like to respond (14)
gender: What is your gender?
• Male (1)
• Female (2)
• Other (3)
• Prefer not to say (4)
hispanic: Are you Hispanic, Latino/a/x, or Latin American Origin?
• Yes (1)
• No (2)
race: What is your race? If you are "mixed race," select all that apply.
• White (1)
• Black or African American (2)
• American Indian or Alaskan Native (3)
• Asian (please specify): (4)
• Other (please specify): (5)
• Prefer not to say (6)
educ: What is the highest level of education that you have completed?
• Less than high school (1)
• High school graduate (2)
• Some college (3)
• Associate's or Technical degree (4)

• Bachelor's degree (5)

• Graduate or professional degree (6)

income: We would be interested to know roughly what your total household income before taxes is. We mean income from all sources, including welfare, stock dividends, other household members' income, etc. In 2020, in which bracket did your total family income fall?

- Under \$1,000 (1)
- \$1,000 to \$9,999 (2)
- \$10,000 to \$19,999 (3)
- \$20,000 to \$29,999 (4)
- \$30,000 to \$39,999 (5)
- \$40,000 to \$49,999 (6)
- \$50,000 to \$59,999 (7)
- \$60,000 to \$74,999 (8)
- \$75,000 to \$89,999 (9)
- \$90,000 to \$109,999 (10)
- \$110,000 to \$129,999 (11)
- \$130,000 to \$149,999 (12)
- \$150,000 or over (13)
- Don't know (14)

age: What is your age? (in years)