

1 **Demographic Factors, Attitudes, and Pre-Existing Conditions Impacting COVID-19**

2 **Vaccine Hesitancy**

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32

### 33 **Highlights**

- 34 • Many factors distinguish uptake of COVID-19 vaccines from hesitancy or refusal.
- 35 • Poorer health and trust in science differentiated hesitancy from refusal.
- 36 • These results may guide early vaccine uptake and readiness for future pandemics.

37

### 38 **ABSTRACT**

39 We aimed to understand factors that distinguish vaccine hesitancy from early uptake or refusal to  
40 inform public health strategies for the next emergent infectious disease pandemic and clinician-  
41 patient communication around vaccine decision-making. The study included 10,176 participants  
42 of the Colorado Center for Personalized Medicine biobank who completed a survey in Summer  
43 2021 which included information on COVID-19 vaccine hesitancy, attitudes, and uptake.  
44 Survey data were linked to electronic health records prior to the COVID-19 pandemic to  
45 catalogue pre-existing health conditions. Early COVID-19 vaccine uptake was high (N=9,873,  
46 96.1%), consistent with high health literacy in this population. While many demographic factors,

47 vaccine considerations, and pre-existing conditions distinguished early uptake from hesitancy or  
48 refusal ( $P<0.05$ ), only two characteristics distinguished the hesitant from the refusal group.  
49 Hesitant individuals were more likely than refusers to report good (31.9% versus 25.8%) or fair  
50 or poor (16.4% versus 13.4%) health. Also, they were less likely to report trust in scientists as a  
51 key factor impacting their decision to receive the COVID-19 vaccine (15.9% versus 25.8%).  
52 These findings highlight the urgent need for more tailored public health strategies to reach the  
53 distinct group of individuals who remain open to vaccination. Healthcare professionals may be  
54 especially well-positioned to address these concerns in clinical conversations by connecting  
55 individual health status and pre-existing conditions to the benefits of vaccination.

56

57 **Clinical Trials Registry:** N/A

58

## 59 **INTRODUCTION**

60 Widespread vaccination is one of the most effective public health strategies for mitigating  
61 the spread and severity of infectious diseases, including COVID-19. The rapid development and  
62 emergency use authorization of COVID-19 vaccines in late 2020 marked a significant milestone  
63 in the global response to the pandemic. However, despite the availability of highly effective  
64 vaccines, hesitancy to receive them emerged as a significant barrier to pandemic control<sup>1,2</sup>.  
65 Vaccine hesitancy refers to a delay in acceptance or refusal of vaccines despite the availability of  
66 vaccination services<sup>3</sup>. Understanding the underlying factors that contribute to vaccine hesitancy  
67 is essential not only for increasing COVID-19 vaccine uptake but also for preparing for future  
68 public health crises<sup>4,5</sup>.

69 Previous research has elucidated several determinants of COVID-19 vaccine hesitancy.  
70 Sociodemographic characteristics associated with vaccine hesitancy include younger age, lower  
71 income, lower educational attainment, uninsured status, and certain racial and ethnic minority  
72 groups<sup>6,7,8</sup>. Attitudinal factors, including mistrust in government or pharmaceutical companies,  
73 concerns about safety and side effects, a perceived lack of urgency, and belief in natural  
74 immunity, have contributed significantly to vaccine hesitancy<sup>6,9,10</sup>. Comorbidities, such as  
75 obesity, diabetes, and chronic lung disease, which are typically risk factors for severe COVID-19  
76 disease, have been shown to influence perceptions of risk and urgency, but do not uniformly  
77 drive individuals toward early vaccination<sup>6,11</sup>.

78 The literature has often categorized vaccine-hesitant individuals alongside those who  
79 firmly reject vaccines, potentially obscuring meaningful distinctions between these groups.  
80 Unlike vaccine refusers, who are unlikely to be persuaded regardless of circumstance, hesitant  
81 individuals often sit on a continuum of indecision and may be influenced by credible  
82 information, trusted messengers, or changes in personal circumstances<sup>12</sup>. This subgroup may  
83 harbor concerns or uncertainties that can be addressed through targeted, empathetic  
84 communication by healthcare professionals<sup>9,10</sup>. Differentiating between these populations is  
85 crucial, as it offers actionable insights into how to increase vaccine uptake during ongoing and  
86 future public health crises.

87 In this study, we investigate the characteristics and attitudes associated with early  
88 COVID-19 vaccine uptake, hesitancy, and refusal among a population enrolled in a large  
89 academic biobank. This analysis draws upon previously published survey data characterizing the  
90 broader impact of the COVID-19 pandemic and integrates electronic health record (EHR) data to  
91 provide a comprehensive profile of vaccination behaviors among a population with high health

92 literacy<sup>13</sup>. By differentiating hesitant individuals from refusers, we aim to identify modifiable  
93 factors that may inform future public health strategies and clinician-patient communication  
94 around vaccine decision-making.

95

## 96 **MATERIALS AND METHODS**

### 97 **Study Population**

98         The Colorado Center for Personalized Medicine (CCPM) biobank was jointly launched in  
99 2015 by the University of Colorado Anschutz Medical Campus and UCHealth as a resource to  
100 accelerate biomedical research and clinical translational efforts in the UCHealth patient  
101 population. The initiation, maintenance, and innovation of this vertically integrated genomic  
102 learning health system has been described in detail previously<sup>14</sup>. Current enrollment occurs  
103 electronically through a self-consent model, where patients access the study consent directly in  
104 the electronic patient portal. Any adult (18 years and older) UCHealth patient is eligible to  
105 participate. Participants provide broad consent for collection of blood, return of clinically  
106 actionable results, use of data for research, and recontact. More than 250,000 adults are enrolled  
107 in the CCPM biobank research study; this group is largely representative of the 2.5 million  
108 UCHealth patient population across Colorado and its surrounding states<sup>14</sup>

109         In response to the global COVID-19 pandemic, we surveyed all living CCPM biobank  
110 participants with a valid email address in 2020 and 2021. We published previously the survey  
111 instruments, administration procedures, and key findings around COVID-19 prevalence, testing  
112 behaviors, symptoms, and electronic health record (EHR) case ascertainment<sup>13</sup>. Briefly, surveys  
113 were delivered by email and study data were collected using REDCap electronic data capture  
114 tools hosted at the University of Colorado. REDCap (Research Electronic Data Capture) is a  
115 secure, HIPPA-compliant database and research management platform (Harris 2009). The

116 resulting data was de-identified, connected to other available data elements (genotypes, EHR),  
117 and made available to researchers in a datamart engineered by Health Data Compass, the  
118 systemwide data warehouse for the University of Colorado Anschutz Medical Campus and  
119 UHealth. Of the 180,599 eligible CCPM biobank participants enrolled as of May 31, 2021,  
120 25,075 (13.9%) completed at least one COVID-19 survey.

121 We restricted this study to the 10,256 participants who answered version 2 of the survey,  
122 which included information about COVID-19 vaccine hesitancy, attitudes, and uptake<sup>13</sup>. Version  
123 2 was administered in Summer 2021, after the COVID-19 vaccines became broadly distributed  
124 and available in Spring 2021. The final analysis included 10,176 participants who did not have  
125 any missing demographics or information regarding their vaccine uptake, age at dosing, or intent  
126 **(Figure 1)**.

127

## 128 **Vaccine Uptake and Factors**

129 Respondents who reported receiving at least one dose of a COVID-19 vaccine were  
130 considered to have vaccine “uptake”. The remainder were further subdivided based on their self-  
131 reported intention to receive the vaccine. Hesitant participants reporting an intention to never  
132 receive a COVID-19 vaccine were categorized as vaccine “refusal”, and the remainder were  
133 considered “hesitant”.

134 All respondents were asked “What factors affect your attitudes and thoughts about getting  
135 a COVID-19 vaccine?” Respondents selected any factors that applied from a list of 11 provided  
136 options, including “Other factors”. Respondents who reported an intention to never receive a  
137 COVID-19 vaccine were asked “What are your reasons for not getting the vaccine?”

138

## 139 **Pre-existing Conditions and Covariates**

140 Sociodemographic and population descriptors obtained from the EHR and the survey  
141 were categorized consistent with prior research in CCPM<sup>13-15</sup> and to maintain at least 10  
142 respondents per level for privacy. Sex, race and ethnicity, and zip code were obtained from EHR  
143 data. We categorized race and ethnicity into a single binary race-ethnicity variable with the  
144 levels Non-Hispanic White and Other for analysis. The “Other” race-ethnicity category includes  
145 Non-Hispanic Black, Hispanic, Asian, American Indian and Alaska Native, Native Hawaiian and  
146 Other Pacific Islander, and Non-Hispanic Other. We categorized respondents into young adult,  
147 mid adult, adult, and older adult categories based on the age at survey completion: 18-29, 30-44,  
148 45-64, 65+. Survey respondents self-reported other descriptive variables, including: highest  
149 educational level obtained, current employment status, overall health status, current smoking  
150 status, and whether any household member had tested positive for COVID-19. Smoking status  
151 was defined as participants currently smoking at least one of these: cigarettes, cigars, e-  
152 cigarettes, nicotine, or marijuana.

153 We determined pre-existing health conditions from EHR records for survey respondents  
154 who were active in the UCHealth system prior to the COVID-19 pandemic. An active patient  
155 was defined as having at least three face-to-face encounters with the UCHealth system between  
156 January 2015 and January 2020. We used the PheWAS R package<sup>16</sup> to identify algorithmic  
157 phenotypes, or phecodes, from ICD-9 and ICD-10 billing codes during the pre-pandemic  
158 window. A participant was considered to have been diagnosed with a pre-existing condition if  
159 any corresponding phecodes occurred at least three times during this time frame. **Supplemental**  
160 **Table 1** shows the list of phecodes associated with each pre-existing condition category. For  
161 example, an individual who had three occurrences of phecode 278 (Overweight, obesity and

162 other hyperalimentation), 278.1 (obesity), or 278.11 (morbid obesity) in their EHR between  
163 January 2015 and January 2020 was considered to have pre-existing obesity. Additional detail on  
164 ascertainment and algorithmic phenotyping of pre-existing conditions is available in Brice et al<sup>15</sup>.

165

## 166 **Statistical Analysis**

167 We described the distribution of sociodemographic, influencing factors, and pre-existing  
168 conditions across the uptake, hesitant, and refusal vaccine groups. Statistical differences between  
169 groups were calculated using analysis of variance test (ANOVA) for continuous variables and  
170 chi-square tests for categorical variables. Statistical significance was assessed using the overall  
171 test across the three groups (*P* for trend) at an alpha of 0.05. For any significant differences  
172 overall, we then conducted pairwise tests to identify which groups were different using adjusted  
173 chi-square tests for categorical variables and Tukey's test for continuous variables. We  
174 conducted data analyses in R version 4.4.2.

175

## 176 **RESULTS**

### 177 **Early COVID-19 vaccine uptake**

178 Out of 10,176 respondents to 2021 survey, 9,783 (96.1%) had received a COVID-19  
179 vaccination ("uptake"), 186 (1.8%) stated an intention to never receive the vaccine ("refusal"),  
180 and 207 (2.0%) had not yet been vaccinated against COVID-19 ("hesitant"). These groups  
181 significantly differed (*P* for trend<0.05) across many sociodemographic and health factors,  
182 including: sex, age, educational attainment, employment, median income based on zip code of  
183 residence, overall health status, current smoking status, and whether a household member had  
184 tested positive for COVID-19 (**Table 1**).

185           Pairwise comparisons indicated that the early group differed from the hesitant group and  
186 from the refusal group for most characteristics. A higher proportion of males reported early  
187 uptake (38.2%) compared to the hesitant group (27.1%). Older adults 65+ years were also more  
188 likely to have early uptake (35.8%) compared to the hesitant (14.0%) and refusal (22.6%)  
189 groups. Compared to those reporting early uptake, hesitant respondents were less likely to hold a  
190 bachelor’s degree (60.4% vs. 77.3%), had lower median income (\$71,500 vs. \$77,000), and were  
191 more likely to be unemployed (13.5% vs. 7.1%), a current smoker (23.2% vs. 14.0%), and have  
192 prior household exposure to COVID-19 (27.5% vs. 10.2%).

193           Overall, self-reported health status was the only characteristic we examined that  
194 significantly distinguished each of the three groups from each other. A higher proportion of  
195 hesitant respondents self-reported “good” (31.9%) or “fair or poor” (16.4%) health compared to  
196 both the early uptake (26.8%, 9.1% respectively) and refusal groups (25.8%, 13.4%  
197 respectively). The refusal group contained the highest proportion of participants with excellent  
198 overall health at 26.3% compared to 21.8% for early uptake and 11.1% for hesitant.

199

## 200 **Factors affecting early COVID-19 vaccine uptake**

201           Eight out of 11 factors affecting thoughts and attitudes about getting a COVID-19  
202 vaccine differed by vaccine uptake group ( $P$  for trend $<0.05$ , **Figure 2**). On average, those in the  
203 unvaccinated groups (hesitant, refusal) reported more factors affecting their vaccination decision  
204 (3.49, 3.99) than those in the early uptake group (3.26). The three factors most commonly  
205 reported by the unvaccinated groups (hesitant, refusal) included the timeline in which the  
206 vaccines were developed and approved (71.5%, 67.2%), the frequently changing messages  
207 around COVID-19 (62.3%, 64.5%), and their own reading and research on coronavirus (COVID-

208 19) vaccines (56.5%, 65.6%). A majority of the refusal group (52.2%) also reported their trust in  
209 public health officials as a key factor in their decision never to get vaccinated. In contrast, a  
210 majority of those receiving early vaccination indicated their trust in scientists (74.2%), their trust  
211 in doctors (67.0%), their trust in public health officials (55.7%), and their own reading and  
212 research on coronavirus (COVID-19) vaccines (59.5%) as key factors affecting their decision to  
213 get vaccinated. More than 950 individuals indicated “other” factors influencing their decision to  
214 get a COVID-19 vaccine, including 9.4% of the early uptake group, 29.0% of the hesitant group,  
215 and 36.0% of the refusal group.

216 **Figure 3** summarizes the reasons given for COVID-19 vaccine refusal (N=186). The top  
217 two reasons, cited by a majority of respondents, were concerns about vaccine safety (60.8%) and  
218 side effects (55.4%). On average, respondents cited >2 reasons for the intention to never receive  
219 a COVID-19 vaccination. More than 40% cited other reasons.

220

### 221 **Pre-existing conditions and COVID-19 vaccination uptake**

222 Of the 10,176 survey participants, 7,915 (77.8%) met our definition of active UCHHealth  
223 patients pre-COVID-19 and were included in the analysis of pre-existing conditions. This subset  
224 had comparable representation by vaccine uptake groups as the full analysis population: 7,597  
225 (96.0%) early uptake, 161 (2.0%) hesitant, and 157 (2.0%) refusal (**Table 2**). Over 60% of this  
226 group had at least one pre-existing condition; hypertension (29.1%), heart disease (20.5%), and  
227 neoplasia (20.4%) were the three most common pre-existing conditions. Unvaccinated  
228 participants (hesitant, refusal) had higher proportions ( $P$  for trend<0.05) of pre-existing obesity  
229 (26.7%, 26.1%) and substance use (15.5%, 14.0%) compared to early uptake participants  
230 (obesity = 18.3%, substance use = 8.1%). There was no difference in vaccine uptake based on

231 pre-existing diabetes, heart disease, hypertension, kidney disease, lung disease, or neoplasia.  
232 There was no significant difference in the rate of pre-existing conditions for the hesitant vs  
233 refusal groups. The average number of pre-existing conditions was similar across groups (uptake  
234 1.31; hesitant, 1.36; refusal, 1.31).

235

## 236 **DISCUSSION**

237 In this study, we examined sociodemographic factors, attitudes, and pre-existing health  
238 conditions associated with early COVID-19 vaccine uptake, hesitancy, and refusal within a  
239 population enrolled in a large academic biobank. Understanding the distinctions between  
240 individuals who are vaccine-hesitant and those who outright refuse vaccination is crucial for  
241 public health efforts aimed at promoting vaccine uptake, especially in preparing for future  
242 infectious disease outbreaks. While we found strong differences between early adopters and  
243 those who delayed or refused vaccination, surprisingly, the differences between the hesitant and  
244 refusal groups were minimal.

245 Consistent with prior research, we found that vaccine hesitancy was more common  
246 among females, current smokers, individuals with lower educational attainment, lower income,  
247 and those who were unemployed<sup>6,8,17</sup>. These findings point to persistent structural and  
248 informational inequities that affect health behavior and access. Interestingly, hesitant individuals  
249 were also more likely to report prior household exposure to COVID-19, possibly reinforcing  
250 perceived natural immunity or ambivalence due to lived experiences of illness in the home.  
251 Indeed, studies have shown that individuals with prior COVID-19 infection are less likely to  
252 receive a COVID-19 vaccine, hypothesizing that perceived immunity is impacting this  
253 decision<sup>18,19</sup>.

254           Among all unvaccinated participants, we found that concerns regarding the rapid timeline  
255 of vaccine development, changing public health messages, and their own research on COVID-19  
256 were the most frequently cited reasons for non-uptake. Previous studies have noted similar  
257 findings<sup>2,6,19</sup>. While these attitudes may reflect caution rather than outright opposition, they also  
258 expose a vulnerability in public health messaging. A majority of all three groups, including early  
259 adopters, indicated that they relied on their own research to inform decision-making around  
260 COVID-19 uptake. This suggests a crucial opportunity to shape public discourse through better  
261 information dissemination. If individuals are actively seeking information, making accurate,  
262 accessible, and widely distributed educational resources is essential to counter misinformation  
263 and build confidence.

264           Our findings revealed few statistically significant differences between the hesitant and  
265 refusal groups, suggesting these populations may share similar foundational concerns and  
266 characteristics. Notably, hesitant participants were more likely to report poorer self-perceived  
267 health status, whereas both early adopters and vaccine refusers were more likely to report  
268 excellent health. These findings highlight the nuanced relationship between self-rated health and  
269 vaccine uptake. While some studies have shown that self-reported poor health is associated with  
270 lower COVID-19 vaccine adoption<sup>20</sup>, others have noted that high satisfaction with health is  
271 associated with vaccine hesitancy<sup>21</sup>.

272           These differences may reflect divergent perceptions of personal vulnerability or vaccine  
273 efficacy. Hesitant individuals may have been more cautious or uncertain about how the vaccine  
274 would affect them personally, particularly in the early phases of the rollout when safety data  
275 were still emerging<sup>2,19</sup>. Conversely, hesitant individuals' perceptions of their health as fair or  
276 poor may have exacerbated their fears of a new vaccine worsening their pre-existing conditions.

277           Although we found no significant differences in the overall number of pre-existing  
278 conditions across early adopters, hesitant individuals, and refusers, specific conditions varied  
279 meaningfully by group. Notably, unvaccinated participants, both hesitant and refusing, had  
280 higher rates of obesity and substance use compared to early adopters. These conditions are well-  
281 established risk factors for severe COVID-19 outcomes<sup>22,23</sup>, making their higher prevalence  
282 among the unvaccinated particularly concerning.

283           When considered alongside self-rated health, these findings offer a potential avenue for  
284 targeted communication to improve vaccine uptake. Healthcare professionals may be able to  
285 leverage nuances in perceived vulnerability during patient discussions. Hesitant individuals,  
286 who were more likely than refusers to report fair or poor health, may be more receptive to  
287 vaccine messaging that emphasizes protection from severe outcomes. In contrast, refusers were  
288 more likely to report excellent health, potentially reinforcing a sense of invulnerability. These  
289 distinctions highlight the importance of addressing perceived health risks and underlying medical  
290 conditions during clinical conversations with hesitant individuals, who may be more open to  
291 engagement than those firmly opposed to vaccination.

292           Trust emerged as a key differentiating factor across vaccine uptake groups. Like previous  
293 studies, early adopters were more likely to cite trust in scientists, doctors, and public health  
294 officials as a factor in vaccine uptake compared to unvaccinated individuals<sup>6,19</sup>. We found that  
295 hesitant participants were less likely than both vaccine adopters and refusers to report trust in  
296 scientists as a key factor impacting their decision to receive the COVID-19 vaccine. This is an  
297 important distinction as science-based arguments may be less likely to persuade hesitant  
298 individuals to vaccinate.

299           A limitation of our study is that we did not ask hesitant individuals about their concerns  
300 related to vaccine safety and side effects. However, these concerns were commonly cited by  
301 refusers and have been widely reported in previous literature<sup>6,19</sup>. Future studies would benefit  
302 from exploring the specific concerns of hesitant individuals to better delineate their position  
303 along the continuum of vaccine acceptance.

304           The biobank setting provided a unique and timely opportunity to collect high-quality  
305 survey and EHR-linked data in response to a rapidly evolving public health emergency. The  
306 ability to deploy a targeted survey shortly after the COVID-19 vaccines became widely  
307 available, combined with retrospective access to participants' clinical data, allowed for novel  
308 analyses of pre-existing conditions and their associations with vaccine behavior. While biobank  
309 participants represent a somewhat self-selected and health-engaged population, the observed  
310 variability in vaccination decisions suggests that even within research-savvy groups, vaccine  
311 refusal and hesitancy persist.

312           Taken together, our findings highlight the urgent need for more tailored public health  
313 strategies. There is a group of individuals who remain open to vaccination but are waiting for  
314 more information or reassurance. These individuals differ from early adopters in nearly all  
315 sociodemographic and attitudinal factors we measured, but they are also distinct from those who  
316 have fully rejected vaccination. Their attitudes, marked by poorer self-perceived health and a  
317 lower reliance on trust in scientists, suggest an important target for intervention. Healthcare  
318 professionals may be especially well-positioned to address these concerns in clinical  
319 conversations by connecting individual health status and pre-existing conditions to the benefits  
320 of vaccination.

321 In conclusion, understanding the differences between early vaccine adopters, the hesitant,  
322 and the refusal groups is critical to improving vaccine uptake and preventing mortality and  
323 morbidity in a future pandemic. While the line between hesitancy and refusal may be thin, it  
324 represents a meaningful opportunity for engagement. Our findings provide guidance for future  
325 outreach efforts aimed at strengthening vaccine confidence and improving readiness for the next  
326 emerging infectious disease threat.

327

### 328 **Conflicts of Interest**

329 The authors declare that they have no known competing financial interests or personal  
330 relationships that could have appeared to influence the work reported in this paper.

331

### 332 **CRedit Author Statement**

333 **Elizabeth L Kudron:** Conceptualization, Supervision, Data Curation, Writing – Original Draft,

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339 Conceptualization, Project administration, Methodology, Writing - Review & Editing. **Randi K**

340 **Johnson:** Conceptualization, Supervision, Formal analysis, Visualization, Writing – Original

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342

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346

### 347 **Data Availability**

348 The dataset used for this study is not publicly available. Interested parties may request access to  
349 CCPM biobank data through the Access to Biobank Committee

350 ([https://medschool.cuanschutz.edu/cobiobank/investigators-industry-partners/access-to-biobank-](https://medschool.cuanschutz.edu/cobiobank/investigators-industry-partners/access-to-biobank-committee-(abc))  
351 [committee-\(abc\)](https://medschool.cuanschutz.edu/cobiobank/investigators-industry-partners/access-to-biobank-committee-(abc))).

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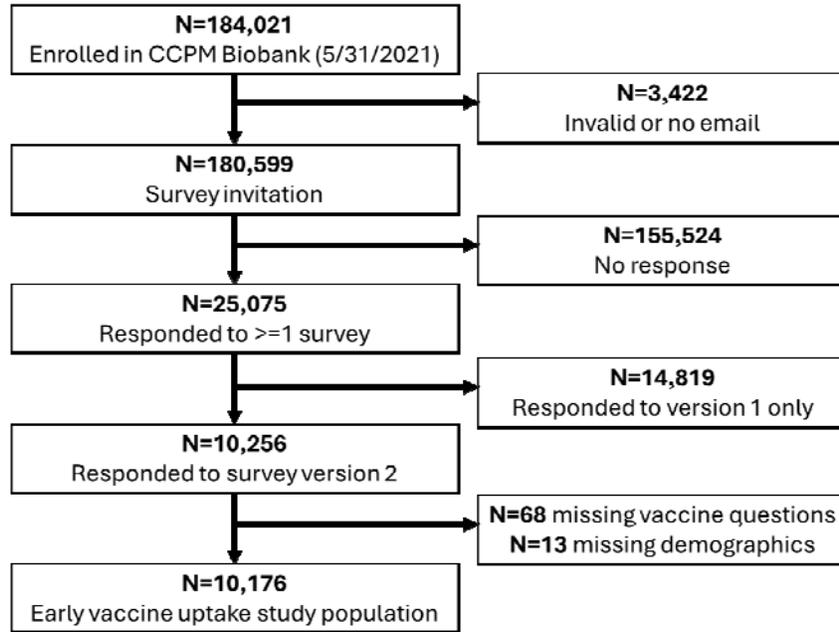
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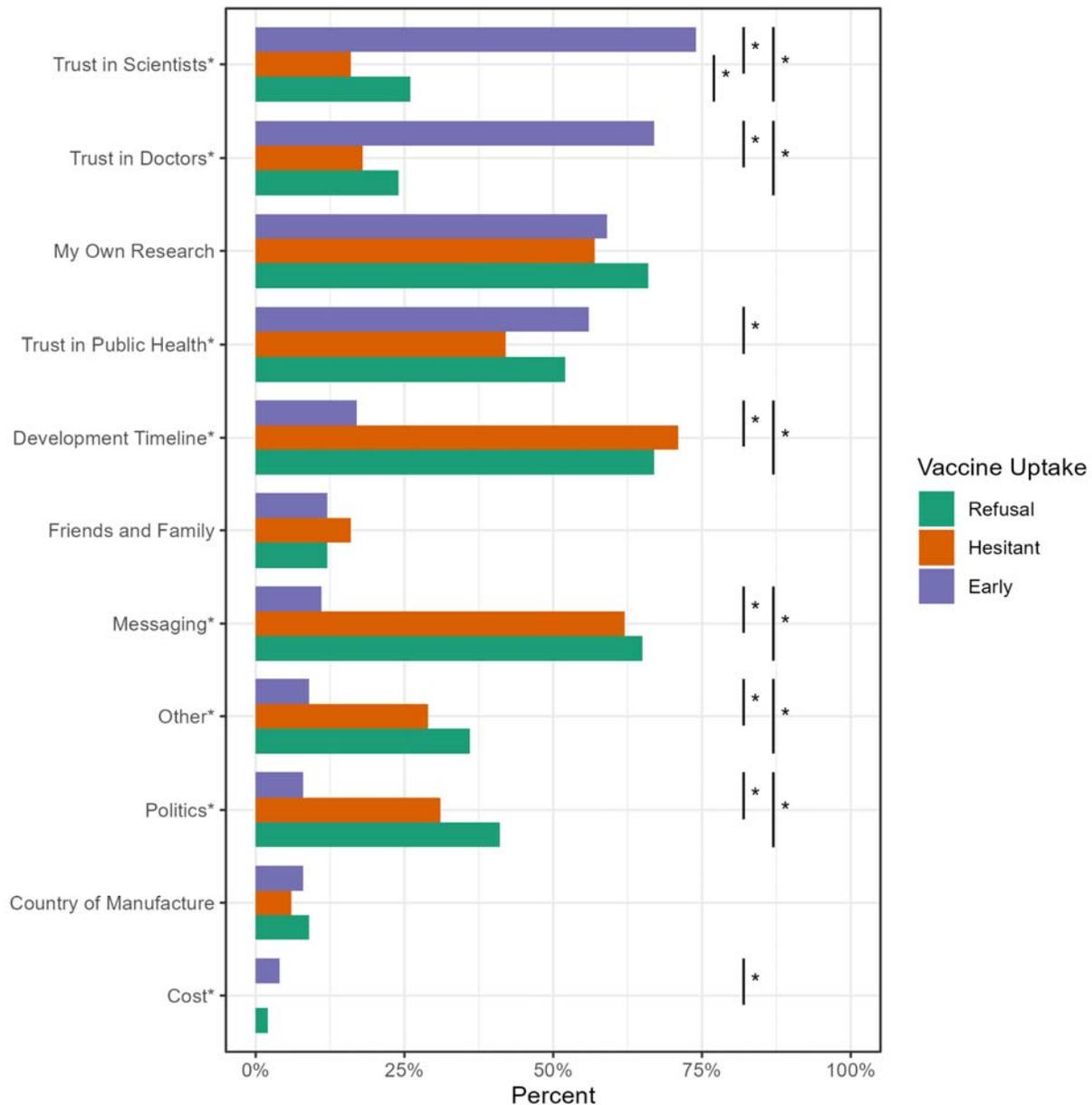


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427 *Figure 1: Early COVID-19 vaccine uptake study population.*

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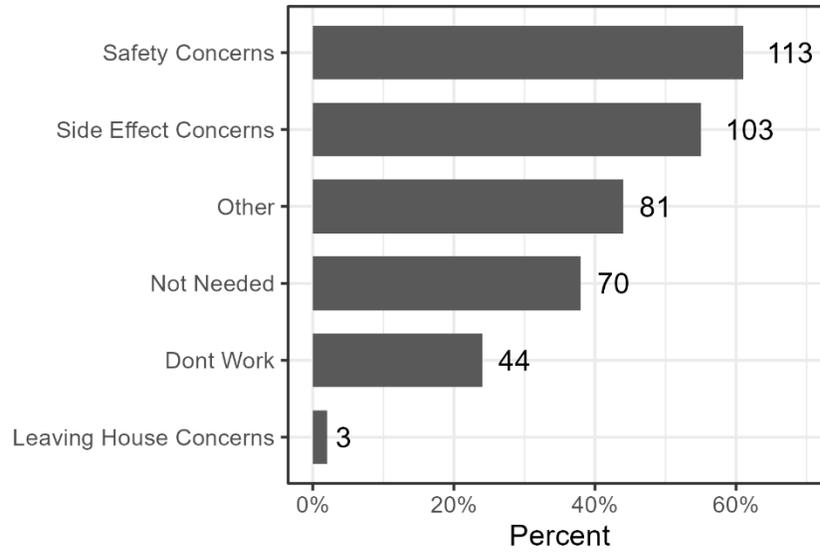
431 **Figure 2: Factors influencing the decision for early, hesitant, or refusal of COVID-19 vaccination.**

432 *Multiple factors could be selected. Asterisks by labels indicate significant differences ( $P < 0.05$  for trend)*

433 *across the three groups. Bars with asterisks indicate significant ( $P < 0.05$ ) pairwise comparisons between*

434 *the indicated groups.*

435



436

437 **Figure 3: Reasons for vaccine refusal.** Count and proportion of vaccine refusal respondents (N=186)

438 reporting each indicator as a factor in their decision to never receive a COVID-19 vaccination. Multiple

439 factors could be selected.

440

*Table 1: Characteristics of COVID-19 survey population by vaccine uptake status*

	<b>Overall</b>	<b>Uptake</b>	<b>Hesitant</b>	<b>Refusal</b>	<b>P-value*</b>
<b>Characteristics</b>	(N=10176)	(N=9783)	(N=207)	(N=186)	
<b>Sex, n (%)</b>					0.003
Female	6316 (62.1%)	6043 (61.8%)	151 (72.9%)	122 (65.6%)	
Male	3860 (37.9%)	3740 (38.2%)	56 (27.1%)	64 (34.4%)	
<b>Age, mean (SD)</b>	55.7 (15.6)	55.9 (15.6)	47.7 (14.1)	50.8 (15.7)	2.20E-16
<b>Age Categories, n (%)</b>					2.73E-13
18-29	511 (5.0%)	476 (4.9%)	21 (10.1%)	14 (7.5%)	
30-44	2335 (22.9%)	2203 (22.5%)	71 (34.3%)	61 (32.8%)	
45-64	3761 (37.0%)	3606 (36.9%)	86 (41.5%)	69 (37.1%)	
65+	3569 (35.1%)	3498 (35.8%)	29 (14.0%)	42 (22.6%)	
<b>Race-Ethnicity, n (%)</b>					0.252
Non-Hispanic White	8849 (87.0%)	8504 (86.9%)	187 (90.3%)	158 (84.9%)	
Other	1327 (13.0%)	1279 (13.1%)	20 (9.7%)	28 (15.1%)	
<b>Bachelor's Degree, n (%)</b>					1.87E-18
Yes	7792 (76.6%)	7562 (77.3%)	125 (60.4%)	105 (56.5%)	
No	2306 (22.7%)	2152 (22.0%)	80 (38.6%)	74 (39.8%)	
Unknown	78 (0.8%)	69 (0.7%)	2 (1.0%)	7 (3.8%)	
<b>Employment, n (%)</b>					4.91E-09
Employed	5553 (54.6%)	5329 (54.5%)	129 (62.3%)	95 (51.1%)	
Retired	3521 (34.6%)	3429 (35.1%)	38 (18.4%)	54 (29.0%)	
Student or Unknown	354 (3.5%)	330 (3.4%)	12 (5.8%)	12 (6.5%)	
Unemployed	748 (7.4%)	695 (7.1%)	28 (13.5%)	25 (13.4%)	
<b>Median Income for Zip Code, mean (SD)</b>	76900 (23800)	77000 (23800)	71500 (22500)	74000 (24800)	0.003
<b>Health Status</b>					1.51E-05
Excellent	2202 (21.6%)	2130 (21.8%)	23 (11.1%)	49 (26.3%)	
Very Good	4214 (41.4%)	4068 (41.6%)	83 (40.1%)	63 (33.9%)	
Good	2736 (26.9%)	2622 (26.8%)	66 (31.9%)	48 (25.8%)	
Fair or Poor	952 (9.4%)	893 (9.1%)	34 (16.4%)	25 (13.4%)	
Missing	72 (0.7%)	70 (0.7%)	1 (0.5%)	1 (0.5%)	

<b>Current Smoker</b>					2.65E-04
Yes	1452 (14.3%)	1370 (14.0%)	48 (23.2%)	34 (18.3%)	
No	8724 (85.7%)	8413 (86.0%)	159 (76.8%)	152 (81.7%)	
<b>Household member tested positive, n (%)</b>					2.26E-27
Yes	1108 (10.9%)	997 (10.2%)	57 (27.5%)	54 (29.0%)	
No	7357 (72.3%)	7132 (72.9%)	121 (58.5%)	104 (55.9%)	
Live Alone	1711 (16.8%)	1654 (16.9%)	29 (14.0%)	28 (15.1%)	

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*Table 3: Early COVID-19 vaccine uptake by pre-existing condition\**

	<b>Overall</b>	<b>Uptake</b>	<b>Hesitant</b>	<b>Refusal</b>	<b>P-value</b>
<b>n (%)</b>	(N=7915)	(N=7597)	(N=161)	(N=157)	
Diabetes	756 (9.6%)	720 (9.5%)	20 (12.4%)	16 (10.2%)	4.36E-01
Heart disease	1621 (20.5%)	1554 (20.5%)	35 (21.7%)	32 (20.4%)	9.23E-01
Hypertension	2303 (29.1%)	2225 (29.3%)	36 (22.4%)	42 (26.8%)	1.29E-01
Kidney disease	421 (5.3%)	406 (5.3%)	9 (5.6%)	6 (3.8%)	6.93E-01
Lung disease	1050 (13.3%)	995 (13.1%)	30 (18.6%)	25 (15.9%)	7.49E-02
Neoplasia	1615 (20.4%)	1558 (20.5%)	30 (18.6%)	27 (17.2%)	5.08E-01
Obesity	1471 (18.6%)	1387 (18.3%)	43 (26.7%)	41 (26.1%)	1.20E-03
Substance use	665 (8.4%)	618 (8.1%)	25 (15.5%)	22 (14.0%)	1.40E-04
At least one pre-existing condition	4797 (60.6%)	4589 (60.4%)	104 (64.6%)	104 (66.2%)	1.93E-01
Number of pre-existing conditions, mean (SD)	1.20 (1.31)	1.19 (1.31)	1.36 (1.35)	1.31 (1.30)	1.61E-01

*\*Pre-existing conditions were defined by the presence of at least three occurrences of a phecode in a participant's EHR between January 2015 and January 2020. Phecodes included for each condition are listed in Supplemental Table 1.*

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*Supplemental Table 1: Map of phecodes used to define pre-existing conditions from electronic health records in the Colorado Center for Personalized Medicine biobank.*

<b>Pre-existing condition</b>	<b>Phecodes</b>
Diabetes	249, 250, 250.1, 250.11, 250.12, 250.13, 250.14, 250.15, 250.2, 250.21, 250.22, 250.23, 250.24, 250.25, 250.3, 250.6, 250.7
Heart Disease	394, 394.1, 394.2, 394.3, 394.4, 394.7, 395, 395.1, 395.2, 395.3, 395.4, 395.6, 411, 411.1, 411.2, 411.4, 411.41, 411.8, 411.9, 414, 414.2, 426, 426.2, 426.21, 426.22, 426.23, 426.24, 426.25, 426.3, 426.31, 426.32, 426.4, 426.8, 426.9, 426.91, 426.92, 427, 427.1, 427.11, 427.12, 427.2, 427.21, 427.22, 427.3, 427.4, 427.41, 427.42, 427.5, 427.6, 427.61, 428, 428.1, 428.2, 428.3, 428.4, 429, 429.1
Hypertension	401, 401.1, 401.2, 401.21, 401.22, 401.3
Kidney Disease	585, 585.1, 585.2, 585.3, 585.31, 585.32, 585.33, 585.34, 585.4, 587
Lung Disease	495, 495.1, 495.11, 495.2, 496, 496.1, 496.2, 496.21, 499, 508, 509, 509.1, 509.2, 509.3, 509.5, 510.2
Neoplasia	145, 145.1, 145.2, 145.3, 145.4, 145.5, 149, 149.1, 149.2, 149.3, 149.4, 149.5, 149.9, 150, 151, 153, 153.2, 153.3, 155, 155.1, 157, 158, 159, 159.2, 159.3, 159.4, 164, 165, 165.1, 170, 170.1, 170.2, 172, 172.1, 172.11, 172.2, 172.21, 172.22, 172.3, 173, 174, 174.1, 174.11, 174.2, 174.3, 180, 180.1, 180.3, 182, 184, 184.1, 184.11, 184.2, 185, 187, 187.1, 187.2, 187.8, 189, 189.1, 189.11, 189.12, 189.2, 189.21, 189.4, 190, 191, 191.1, 191.11, 193, 194, 195, 195.1, 195.3, 198, 198.1, 198.2, 198.3, 198.4, 198.5, 198.6, 198.7, 199, 199.4, 200, 201, 202, 202.2, 202.21, 202.22, 202.23, 202.24, 204, 204.1, 204.11, 204.12, 204.2, 204.21, 204.22, 204.3, 204.4, 209, 230
Obesity	278, 278.1, 278.11
Substance Use	316, 316.1, 317, 317.1, 317.11, 318