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SCALE-UP II: Protocol for a Pragmatic Randomized Trial Examining Population Health Management Interventions to Increase the Uptake of At-Home COVID-19 Testing in Community Health Centers

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3 SCALE-UP II: Protocol for a Pragmatic Randomized Trial Examining Population Health Management
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5 Interventions to Increase the Uptake of At-Home COVID-19 Testing in Community Health Centers
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ABSTRACT

Introduction. SCALE-UP II aims to investigate the effectiveness of population health management interventions using text messaging (TM), chatbots, and patient navigation (PN) in increasing the uptake of at-home COVID-19 testing among patients in historically marginalized communities, specifically those receiving care at safety net community health centers (CHCs).

Methods and Analysis. The trial is a multi-site, individually randomized pragmatic clinical trial. Eligible patients will be ≥ 18 years old with a primary care visit in the last three years at one of the participating CHCs. Patient demographic data will be obtained from CHC electronic health records. Patients will be randomized to one of two factorial designs based on smartphone ownership. Patients who self-report replying to a text message that they have a smartphone will be randomized in a 2x2x2 factorial fashion to receive (i) chatbot or TM; (ii) PN (yes or no); and (iii) repeated offers to interact with the interventions every 10 or 30 days. Participants who do not self-report as having a smartphone will be randomized in a 2x2 factorial fashion to receive (i) TM with or without PN; and (ii) repeated offers every 10 or 30 days. The interventions will be sent in English or Spanish, with an option to reply requesting free at-home COVID-19 test kits. The primary outcome will be the proportion of participants using at-home COVID-19 tests during a 90-day follow-up. The study will evaluate main effects and interactions among interventions, implementation outcomes, and predictors and moderators of study outcomes. Statistical analyses will include logistic regression, stratified subgroup analyses, and adjustment for stratification factors.

Ethics and dissemination: The study protocol was approved by the University of Utah Institutional Review Board. On completion, study data will be made available in compliance with National Institutes of Health data sharing policies.

Trial registration: Clinicaltrials.gov (NCT05533918 and NCT05533359).

Keywords: COVID-19, digital health, health equity, population health management

Strengths and limitations of this study

- At-home COVID-19 testing is an important strategy to help reduce exposure and offer timely treatment to individuals at a higher risk for severe disease.
- The population health management interventions are scalable and will enable increasing the reach and uptake of at-home COVID-19 testing.
- Dissemination strategy modalities (i.e., voice and text cellphones) are nearly ubiquitous among adults in the United States, including among historically marginalized populations.
- Patient population will be drawn from community health centers in a single state.

INTRODUCTION

Racial/ethnic minority, low socioeconomic status (SES), and rural populations suffer profound health inequities across a wide variety of conditions, including a higher rate of hospitalization and mortality due to COVID-19.¹⁻⁴ Similar inequities have been found across the US for vaccination rates between urban and rural,⁵ high and low SES,⁶ and White and non-White populations.^{7,8} Low vaccination rates and withdrawal of protection measures leave historically marginalized populations at high risk for local outbreaks and more contagious variants.

Although public health agencies worldwide have declared the end of the pandemic, timely testing is still important to help reduce exposure and offer timely treatment to individuals at a higher risk for severe disease. However, historically marginalized communities lacked easy and convenient access to testing throughout the COVID-19 pandemic, especially after the closure of mass test sites nationwide.^{9,10} Although several FDA-approved at-home tests are available, providing a convenient, quick and low-cost alternative for patients to test at home,^{11,12} substantial disparities exist in the use of at-home COVID-19 testing. While the use of at-home COVID-19 testing has more than tripled between the Delta and Omicron outbreaks, use of at-home testing was more than twice as high among individuals identifying as White, having high SES, and having a postgraduate degree.¹³ Thus, scalable approaches are needed to promote the uptake of at-home COVID-19 testing among individuals from historically marginalized communities.

Despite evidence of a digital divide between high resource healthcare systems and low resource community health centers (CHCs),^{14,15} historically marginalized populations have almost universal access to technology such as cellphones, which provide opportunities for large scale population health management (PHM) interventions. Even in households with annual incomes less than \$30,000, 97% own a cellphone and 76% own a smartphone.¹⁶ The SCALE-UP II trial will investigate three PHM interventions (text messaging [TM], automated chatbot, and patient navigation [PN]) to increase the reach and uptake of at-home COVID-19 testing among patients who receive care at CHCs.

METHODS AND ANALYSIS

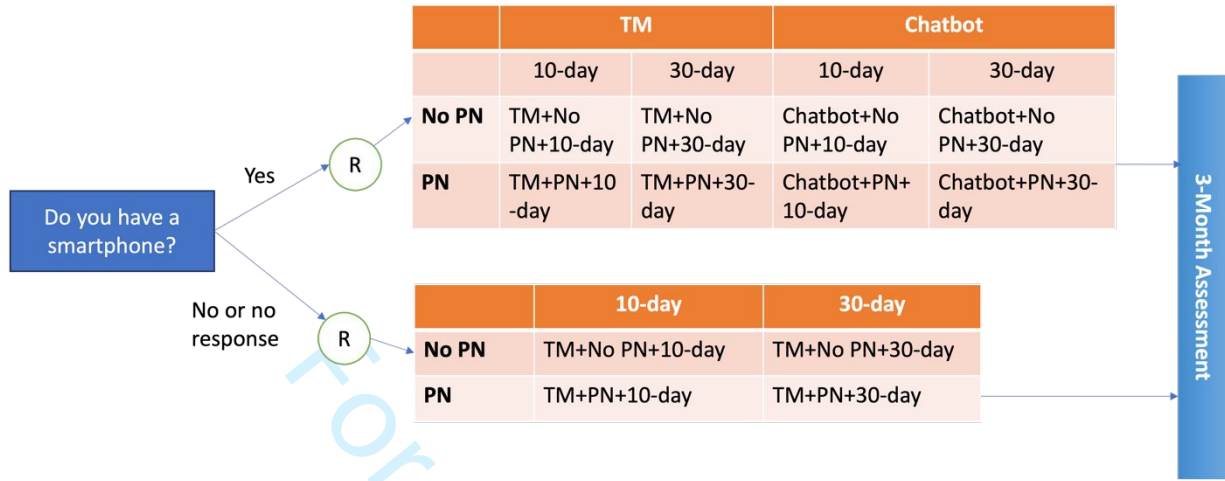
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This protocol was developed using the Standard Protocol Items: Recommendations for
Interventional Trials (SPIRIT).¹⁷ The protocol was approved by the Institutional Review Board at the
University of Utah on June 10, 2022 (IRB_00150669). The trial was registered with Clinicaltrials.gov
(NCT05533918 and NCT05533359) on September 9, 2022. Enrollment was planned to begin in
December 2022 and data collection was planned to end in November 2023.

Patient and Public Involvement

SCALE-UP II is conducted in partnership with the Association for Utah Community Health
(AUCH), CHCs across Utah, the Utah Department of Health and Human Services (UDHHS), and the
University of Utah. Our research-practice partnership uses a multi-pronged community engagement
approach to (i) identify research questions, (ii) develop, adapt, and implement interventions, and (iii)
inform dissemination plans.^{18,19} The community engagement approach includes a weekly project meeting
with AUCH, UDHHS, and the research team and quarterly Patient Advisory Committee (PAC; consisting
of CHC patient representatives) and Study Advisory Committee (SAC; consisting of patients, CHC staff,
UDHHS, and AUCH representatives) meetings. The research objectives of SCALE-UP II were identified
in partnership with AUCH and UDHHS; both AUCH and UDHHS were interested in addressing the
impact of COVID-19 among historically marginalized communities in Utah. Input from the PAC
informed the design of the text messaging and chatbot interventions. Furthermore, TM and Chatbot
scripts were developed following information gathered from community members in Utah.

Study Design

SCALE-UP II is an individually randomized, multi-site, pragmatic clinical trial. The experimental
design varies according to each patient's response to a text message asking if they have a smartphone.
Participants who self-report that they have a smartphone will be randomized in a 2x2x2 factorial fashion
to receive (i) chatbot or TM; (ii) PN (yes or no); and (iii) repeated offers to interact with the interventions
every 10 or 30 days. Participants who do not respond to the introductory text message or who self-report
as not having a smartphone will be randomized in a 2x2 factorial fashion to receive (i) TM with or
without PN; and (ii) repeated offers every 10 or 30 days.



R=randomization; PN=patient navigation; TM=text messaging

Figure 1 – SCALE-UP II Trial Design

Rationale for Study Design

The interventions in SCALE-UP II leverage (i) wide adoption of electronic health record (EHR) systems, even in low resource CHCs;^{20,21} (ii) wide adoption of cellphones with at least voice and text capabilities;¹⁶ and (iii) the low cost, efficiency, and simplicity of at-home COVID-19 tests.^{11,12} Therefore, SCALE-UP II is designed to maximize reach with low-cost interventions to increase the uptake of COVID-19 testing in historically marginalized communities.

SCALE-UP II will enroll patients from Utah CHCs. These settings provide primary care to diverse, low SES populations, and provide an ideal setting to address COVID-19 because there is an established relationship and coordination of care, and ~80% of individuals see a primary care provider at least annually.²² Three Utah CHC systems and their 12 primary care clinics will participate in SCALE-UP II. Demographics of SCALE-UP II CHC patients include: 51% Latino, 62% $\leq 100\%$ federal poverty level, 69% uninsured, and receiving care in clinics where 17% are in rural/frontier areas.²³

Since the chatbot requires a smartphone with connection to the internet, and about 25% of individuals with low SES and from rural areas do not have a smartphone,¹⁶ SCALE-UP II will enroll patients in one of two factorial designs based on their smartphone ownership in order to maximize reach to the 96% of individuals who own at least a voice and text cellphone.

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3 Patients may be reluctant to test due to hesitancy and numerous other barriers.^{24,25} However,
4 practical advice from patient navigators such as community health workers can help overcome hesitancy
5 and engagement barriers such as logistics, transportation, and expense; of critical importance, providers
6 welcome the use of these approaches with their patients.²⁶⁻²⁸ Thus, in addition to the TM and chatbot
7 interventions, SCALE-UP II will examine the added effect of offering access to patient navigation upon
8 request through either intervention. Since patient navigation is a human-intensive intervention, examining
9 the uptake of patient navigation when provided only upon request is critical for conserving resources in
10 limited resource settings such as CHCs.
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19 20 **Participants**

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22 The study inclusion criteria aim to enroll a broad range of individuals to maximize reach. Eligible
23 patients will be those who (i) have been seen at one of the participating CHCs in the last three years, (ii)
24 are 18 years and older, (iii) have a working cellphone listed in the CHC EHR, and (iv) indicate a language
25 preference in the EHR of English or Spanish.
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31 The study will exclude participants who opt out upon receipt of the introductory message asking
32 about smartphone ownership. Also, if more than one patient shares the same smartphone number in the
33 EHR, only the patient with the most recent documented clinical encounter will be included.
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37 **Recruitment**

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39 As a pragmatic trial with interventions that offer minimal risk, the University of Utah IRB
40 approved a waiver of consent for randomization and receipt of PHM interventions. Therefore, all
41 participants who meet eligibility criteria will be automatically enrolled in the study. All three study points
42 of contact (TM, chatbot, PN) will allow participants to opt-out through a simple reply at any time.
43 Participants will be consented to complete the 3-month follow-up survey prior to survey completion using
44 a consent cover letter.
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51 **Randomization and Blinding**

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53 Participants who self-report having a smartphone will be randomized to one of eight study arms
54 (Figure 1): (1) TM+10-day, (2) TM+30-day, (3) Chatbot+10-day, (4) Chatbot+30-day, (5) TM+PN+10-
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3 day, (6) TM+PN+30-day, (7) Chatbot+PN+10-day, or (8) Chatbot+PN+30-day. Participants who do not
4 self-report to have a smartphone will be randomized to one of four study arms: (1) TM+10-day, (2)
5 TM+30-day, (3) TM+PN+10-day, or (4) TM+PN+30-day. Participants will be randomized after receiving
6 the introductory text message asking if they have access to a smartphone.
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11 Randomization will be implemented by software and will utilize randomized permuted blocks to
12 guard against any biases due to ordering of patients. Furthermore, the randomization will be stratified by
13 CHC and urban/rural designation of the participant's zip code according to rural-urban commuting area
14 (RUCA) codes.
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19 The study is outcome assessor and investigator blinded. Patient navigators cannot be blinded to
20 treatment assignment. Participants will be blinded to study participation.
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24 Study Interventions

25 Overall, all study interventions (i) are sent on behalf of the participant's clinic, (ii) offer the
26 option to request at-home mailed COVID-19 test kits at no cost for use as needed, (iii) are provided
27 automatically in English or Spanish based on the patient's preferred language in the CHC EHR, and (iv)
28 provide an option for participants to opt-out at any time (see Figures 2 and 3).
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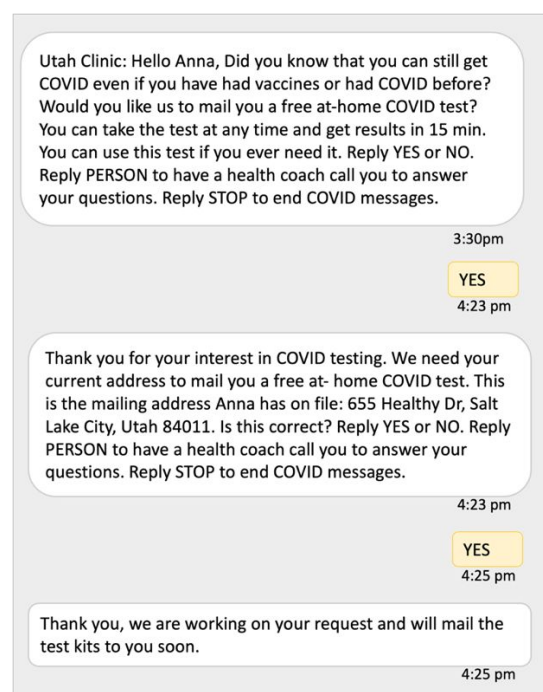


Figure 2 – Sample text message conversation offering COVID-19 at-home testing.

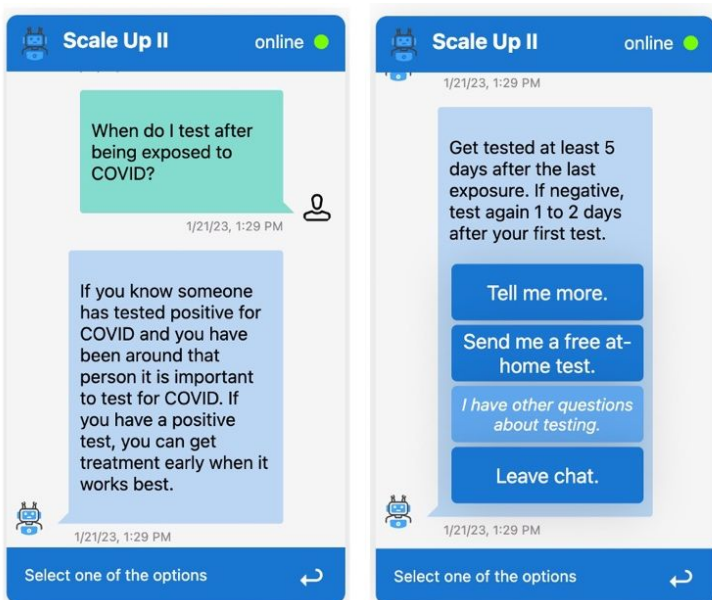


Figure 3 – Sequential screenshot of chatbot intervention showing a question being answered, followed by options to ask further questions, and request a COVID-19 test kit to be mailed to the patient's home.

Text Messaging (TM). Meta-analyses of text messaging interventions have found these approaches to be promising for improving compliance with healthy behaviors and preventive care, beneficial for multiple racial/ethnic groups, and inexpensive to deliver.²⁹⁻³⁴ A US Department of Health and Human Services review concluded: *With the near-ubiquitous presence of cellphones and the rapid growth of smartphones, text messaging and other mHealth interventions can remove traditional geographic and economic barriers to access to health information and services. The higher rates of mobile phone ownership and use among Blacks and Hispanics, compared to Whites, are particularly noteworthy. These interventions have the potential to improve health knowledge, behaviors, and outcomes and, ultimately, to reduce disparities.*³⁴ Our own research has demonstrated that a simple, repeated offer to connect unmotivated, low-SES individuals with treatment resources resulted in 25% of individuals enrolling in tobacco cessation treatment.³⁵ Thus, repeated prompting offering access to COVID-19 testing via texts is an extremely convenient, low cost, scalable approach for increasing testing uptake.

TM will consist of bidirectional text messaging sent on behalf of the participant's clinic with a

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3 response option for patients to request at-home mailed COVID-19 test kits at no cost (Figure 2).

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5 Participants randomized to TM+PN will also be able to reply requesting to speak with a patient navigator.

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7 Messages will be sent in English or Spanish based on the patient's language preference in the EHR.

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9 Chatbot. Chatbots are automated conversational agents designed to mimic human interaction.
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11 Chatbots are increasingly popular in various health contexts as they can be easily accessed through
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13 smartphones, tablets, laptops, or desktops. Chatbots have many advantages for patient engagement,
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15 including providing scripted education interactively, chunking information into small segments that are
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17 easier to process, and allowing for choice in the amount of information received. Chatbots are accessible
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19 to the vast majority of U.S. adults. Even in households with annual incomes less than \$30,000, 76% own
20
21 a smartphone.^{16,36,37} Delivery of health services through chatbots in research contexts has been
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23 successfully tested in various health domains such as mental health, asthma, diabetes management, and
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25 physical activity uptake.³⁸ While scripted chatbots have been widely used in the COVID-19 pandemic,
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27 especially to evaluate patient's eligibility for testing and vaccination,³⁹⁻⁴⁴ research is needed to examine
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29 their benefits in addressing COVID-19 at-home testing. In addition, there is a lack of studies that
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31 investigated the design and implementation of chatbots specifically for historically marginalized
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33 populations.
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37 For SCALE-UP II, we designed a scripted chatbot (i.e., predefined conversation script, and a fixed set
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39 of questions and scripted answers) that presents participants with a list of topics that address most
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41 common knowledge gaps and hesitancy factors related to at-home COVID-19 testing (Figure 3). The
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43 chatbot script was designed and guided by findings from a national survey and in-depth interviews with
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45 participants in the targeted Utah population, both conducted by our team. The following topics are
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47 covered: benefits of testing (even when already vaccinated or previously had COVID), when to test, test
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49 accuracy, how to use a test, and what to do if a test is positive.
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52 Patients in the chatbot condition will receive a text message on behalf of their clinic offering a
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54 hyperlink to access the chatbot on the phone's web browser. At any point in the chatbot, participants will
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56 be able to click a button to request an at-home test kit. Participants randomized to the PN condition can
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3 also click PERSON to request to speak to a patient navigator. As in TM, the chatbot is offered both in
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5 English and Spanish.
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7 Patient Navigation (PN). SCALE-UP II will use community health workers (CHWs) employed
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9 by AUCH as patient navigators to address practical barriers, motivation, and hesitancy to COVID-19
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11 testing. To assist navigators in working with patients, CHWs will be trained in an empirically-validated
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13 behavior change approach (Motivation And Problem Solving; MAPS).⁴⁵⁻⁵⁰ MAPS is a holistic, dynamic
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15 approach to behavior change that integrates two empirically validated approaches (motivational
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17 interviewing^{51,52} and practical problem solving^{47,53,54}) for helping patients engage in target behaviors.<sup>45-
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19 47,49,50</sup> Importantly, MAPS addresses patients' social determinants of health, and provides practical advice
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21 and connections to services whenever possible, including addressing testing concerns (e.g., worries about
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23 repercussions of a positive test, infecting family members, quarantining, financial). MAPS has been
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25 demonstrated to be effective in numerous randomized controlled trials with respect to increasing
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27 enrollment in evidence-based interventions, as well as enhancing and maintaining behavior change.<sup>45-
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29 47,49,50</sup>
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33 All SCALE-UP II navigators will receive ~20 hours of training, consistent with recommended
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35 training for helpline specialists.⁵⁵ Participants randomized to the PN condition who request to speak with
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37 a patient navigator will receive a phone call within 48 hours. Patient navigators will make three attempts
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39 to contact a participant.
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41 **Study Roll-Out Schedule**

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43 To ensure that the interventions work properly with real patient data, a pilot study will be
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45 conducted with a random sample of patients from one of the participating CHCs both for the TM and
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47 Chatbot interventions.
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50 For the remainder of patients, to address bottlenecks that depend on non-automated processes
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52 (e.g., mailing of test kits, patient navigation), study participants will be exposed to interventions in one of
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54 14 weekly batches according to a pre-defined schedule, in which a cohort with a new set of participants is
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56 added to the study every week. Participants will be randomly allocated across the 14 batches, also
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3 stratified by CHC and urban vs. rural.
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5 Every cycle starts by sending the introductory message to participants in the cohort (Day -2).
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7 Participants will have two days to respond. After that, eligible participants will be randomized into one of
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9 the two factorial designs depending on their response to the introductory message (Day 0). After
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11 randomization, participants will receive messages offering access to at-home testing once every 10 versus
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13 30 days for 7 weeks (Days 0, 10, 20, 30, 40, 50, and 60 vs. Days 0, 30, and 60).
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16 **Outcome Assessment**

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18 The main study outcomes are described below. Table 1 provides a complete list including the
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20 primary, secondary outcomes, and implementation outcomes, as well as predictors and moderators of
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22 study outcomes.
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24 Primary Outcomes and Hypotheses. The primary outcome is *Testing*; the proportion of study
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26 participants who use an at-home COVID-19 test during the course of 90-day study follow-up as defined
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28 below. For all patients, regardless of self-report of smartphone ownership, the primary hypotheses are
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30 main effects for PN (PN > No PN), main effects for message frequency (10-day > 30-day), and that
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32 TM+PN will lead to higher *Testing* than TM. These hypotheses will be tested at an alpha of .0167,
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34 adjusted for multiple comparisons using the Bonferroni method. Because we anticipate a low sample size
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36 of smartphone self-reporters to be adequately powered, we consider Chatbot-related hypotheses as
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38 secondary. These include the hypothesis that Chatbot will lead to a higher *Testing* than TM and that
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40 Chatbot+PN will lead to a higher *Testing* than Chatbot without PN. These hypotheses will be tested at
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42 alpha of .05.
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45 Secondary and Implementation Outcomes. We will evaluate Chatbot+PN versus Chatbot,
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47 interaction effects, and indicators of TM, Chatbot, and PN implementation among participants.
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49 Implementation outcomes measure the extent of the delivery and adaptation of intervention components,
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51 including *Reach-Engage Testing* (proportion of participants who are offered at-home testing and reply to
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53 the message or launch the Chatbot), *Reach-Accept Testing* (proportion of participants who are offered at-
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home testing and reply accepting or select “Send me a test” on the Chatbot), *PN-Request* (proportion of participants in the PN condition who request patient navigation), *PN-Engage* (proportion of participants in the PN condition who talk to a patient navigator), and *Opt-Out* (proportion of participants who opt-out). We will analyze chatbot usage patterns (e.g., time using chatbot, topics visited) as listed in Table 1.

Predictors and Moderators of Study Outcomes. We will assess predictors and moderators including demographics, vaccination status, and Tier 1 Common Data Elements (CDEs) used by the Rapid Acceleration of Diagnostics-Underserved Populations (RADx-UP) program of the U.S. National Institutes of Health (NIH).⁵⁶

Study Assessments. The primary outcome *Testing* will be collected through two methods from patients who requested a test kit: (i) a brief text message sent 90 days after the first exposure to interventions asking if they used the mailed COVID-19 test (patients are asked to reply with a single YES or NO response to the text message); and (ii) a survey sent to participants 7 days after the last exposure to study interventions (Day 97). Secondary outcomes *Reach-Engage Testing*, *Reach-Accept Testing*, *PN-Request*, *PN-Engage*, and *Opt-Out* will be obtained from computer system logs. The survey will also collect Tier 1 CDEs. To complete the survey, participants will be invited via mail and text message to complete a survey. Non-responders will also be called via phone to complete an interviewer-administered survey. Vaccination status will be obtained from the Utah State Immunization Information System (USIIS). Other predictors and moderators of study outcomes will be collected from EHR data (e.g., demographics) and online surveys (i.e., Tier 1 CDEs).

Table 1 - Study Assessments.

Assessment	Baseline	During exposure to interventions	Day 90 Follow-Up (via text msg)	Day 97 Follow-Up (via survey)	Description
Demographics	X			X	Age sex, race, ethnicity, preferred language, insurance status, etc.
Testing (primary outcome)			X	X	Proportion of study

Assessment	Baseline	During exposure to interventions	Day 90 Follow-Up (via text msg)	Day 97 Follow-Up (via survey)	Description
					participants who use an at-home COVID-19 test during the course of the study
Number of tests used			X	X	Self-reported number of tests used by each study participant who requested a test.
Vaccination status	X			X	COVID-19 vaccination status according to state immunization registry
NIH RADx-UP CDE data elements (Tier 1)				X	Comprehensive questionnaire (234 items) including demographics, COVID testing, symptoms, health status, social determinants of health, etc.
Implementation Outcomes					
Reach-Engage Testing		X			Proportion of participants who are offered at-home testing and reply to the message or launch the chatbot
Reach-Engage Frequency		X			Number of times a participant replied to a message offering at-home testing or launched the chatbot
Reach-Accept Testing		X			Proportion of participants who are offered at-home testing and reply accepting
Reach-Engage Frequency		X			Number of times a participant replied to a message/chatbot requesting at-home testing
PN-Request		X			Proportion of participants in the PN condition who request patient navigation
PN-Request Frequency		X			Number of times a participant requested to speak with a patient navigator

Assessment	Baseline	During exposure to interventions	Day 90 Follow-Up (via text msg)	Day 97 Follow-Up (via survey)	Description
PN-Engage		X			Proportion of participants in the PN condition who talk to a patient navigator
PN-Engage Frequency		X			Number of times a participant spoke with a patient navigator
Opt-Out		X			Proportion of participants who opted-out
Chatbot use					
Chatbot session length		X			Amount of time spent using the chatbot in a session
Chatbot timeout		X			Proportion of chatbot sessions that timed out without reaching an endpoint (e.g., close chatbot window, request test, request to talk to patient navigator)
Chatbot actions		X			Number of chatbot topics clicked per session
Chatbot test request only		X			Proportion of chatbot session in which the only action was requesting a test
Chatbot coverage		X			Proportion of chatbot contents that are accessed per session
Chatbot topics		X			Proportion of sessions in which a specific chatbot topic is accessed

Statistical Analysis. The main effects of each intervention will be evaluated using a logistic regression model by regressing 90-day testing upon each of the three main effects: Chatbot (vs. TM) with an indicator for self-reporting to have a smartphone, PN (vs. no PN), and outreach frequency (10 vs. 30 days). We will preliminarily include the pairwise interactions of the main effects, and the three-way interaction to assess for any synergistic and/or antagonistic effect modifications across interventions and will include any statistically significant effect modifications (i.e., interactions) in the primary analysis

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3 model. The model will adjust for whether the patient self-reported having a smartphone. Estimates and
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5 95% confidence intervals will be reported for each main effect and interaction effect. If an interaction
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7 term was included for having evidence of an effect modification, we will report the main effects
8
9 separately for each level of the effect modifying intervention. The model will be run on all participants to
10
11 evaluate the primary hypotheses, each tested at alpha of .0167, and it will be applied to the smartphone
12
13 participants to evaluate the secondary hypotheses.
14

15
16 Among the smartphone subgroup, we will fit the primary analysis model to evaluate all other
17
18 main effects as a secondary analysis. We will also test the added effect of PN among those randomized to
19
20 receive Chatbot. Among the remaining patients, we will regress 90-day testing upon PN (yes vs no) and
21
22 outreach frequency (10 vs 30 days). We will include an interaction if a preliminary model provides
23
24 evidence of an effect modification. Side-by-side, we will present the estimated effects across all patients
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26 and by smartphone ownership subgroup.
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29 Handling Missing Data. The primary analysis will assume missing outcomes and covariates are
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31 missing at random (MAR). Under this assumption, observed covariates can be used to explain the
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33 missingness mechanism. When conditioning on observed covariates, the distribution of outcomes is
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35 assumed to be similar among responders and non-responders. With this framework, we will omit missing
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37 outcomes,⁵⁷ multiply impute missing covariates using a fully conditional specified model,⁵⁸ and account
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39 for the multiple imputations in analysis.⁵⁹ While MAR is considered a reasonable starting point
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41 assumption for missing data, it is plausible that responders and non-responders have different outcomes
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43 beyond what can be adjusted by covariates (i.e., missing not at random; MNAR). We will use pattern
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45 mixture models as a sensitivity analysis to assess the robustness of conclusions under the MAR
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47 assumption.⁶⁰
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50 Sample Size Justification. Power for SCALE-UP II was evaluated for a target enrollment of
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52 42,000 adults aged 18 year and older who receive care at the three participating CHCs, have a valid
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54 cellphone recorded in the EHR, and have English or Spanish as their preferred language in the EHR.
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56 Among those patients, we anticipate fewer than 10% opt outs. We assume 75% will have a smartphone
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3 and 10% to self-report as having a smartphone. Among these patients with a self-reported smartphone, we
4 anticipate ~375 patients in each of the eight study arms. Among patients who do not self-report as having
5 a smartphone, we expect ~8,750 patients in each of the four arms.
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9 We hypothesize that TM with no PN and a 30-day outreach will have a 5% at-home testing rate
10 and that PN, Chatbot, and 10-day outreach frequency will increase the testing rate by 5% each without a
11 synergistic effect. We hypothesize the at-home testing rate to be 5% less when outreach occurs every 30
12 days. We anticipate a $\geq 40\%$ response rate for the primary outcome. Under these assumptions, and with
13 alpha adjusted to .0167, we are essentially fully powered to test the primary hypotheses. If the response
14 rate is 20%, we are at least 85% powered to test these effects. In secondary analyses, with alpha of .05
15 and a 40% response rate, we are 75% powered to detect the Chatbot main effect of and 68% powered to
16 detect the added effect of PN.
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26 **DISCUSSION**

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28 Individuals from historically marginalized communities have suffered substantial health
29 inequities throughout the COVID-19 pandemic, not only in terms of outcomes but also vaccination rates
30 and access to testing.^{1-8,61,62} PHM approaches leveraging widely adopted EHR systems and technology
31 such as cellphones provide excellent opportunities to deliver scalable interventions to improve health
32 equity. The SCALE-UP II trial aims to examine scalable and sustainable PHM interventions to increase
33 the uptake of at-home COVID-19 testing among individuals who receive care from low resource CHCs.
34 Strengths include a pragmatic trial with broad inclusion criteria leveraging existing EHR data; highly
35 scalable automated interventions; and a novel design that compares two digital patient engagement
36 approaches (TM and Chatbot), examines the added effect of a human-augmented intervention (patient
37 navigation) over digital interventions, and compares two frequencies (every 10 days or 30 days) of
38 repeated offers to receive COVID-19 testing.
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51 Even though public health agencies worldwide have declared the end of the COVID-19
52 pandemic, COVID-19 testing is still critical to help reduce exposure and to identify individuals who can
53 benefit from treatment. In addition, approaches are needed to support public health preparedness for
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3 future pandemics and outbreaks. The proposed interventions in SCALE-UP II leverage resources that are
4 currently available at CHCs and therefore can be sustained in the long term.
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7 **Limitations**

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9 The study design has several limitations. First, a potentially low response rate to the introductory
10 message asking about smartphone ownership could lead to a small sample size and randomization of only
11 motivated individuals to the chatbot condition. We considered randomizing all participants to Chatbot vs.
12 TM, but patients who do not have a smartphone (estimated as 25% of the CHC patient population) and
13 are randomized to the chatbot condition would not be able to use the chatbot, compromising study reach.
14
15 Second, the study relies on self-report for the primary outcome (*Testing*). To maximize response rates, we
16 use two approaches to collect the primary outcome: a quick question via text messaging after exposure to
17 study interventions and a survey at the end of the study. Last, the study will be conducted after the peak of
18 the pandemic, when participants may be less motivated to learn about and receive COVID-19 testing.
19
20 Also, individuals have been overexposed to information about COVID-19 from multiple sources and may
21 have already formed their opinions about COVID-19 and COVID-19 testing. Therefore, it is possible that
22 study findings may not generalize to the context of new onset of a pandemic or outbreak.
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38 Disparities (NIMHHD) of the U.S. National Institutes of Health (NIH) grant number 5U01MD017421.
39
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41 **Competing interests statement.** The authors declare no competing interests.
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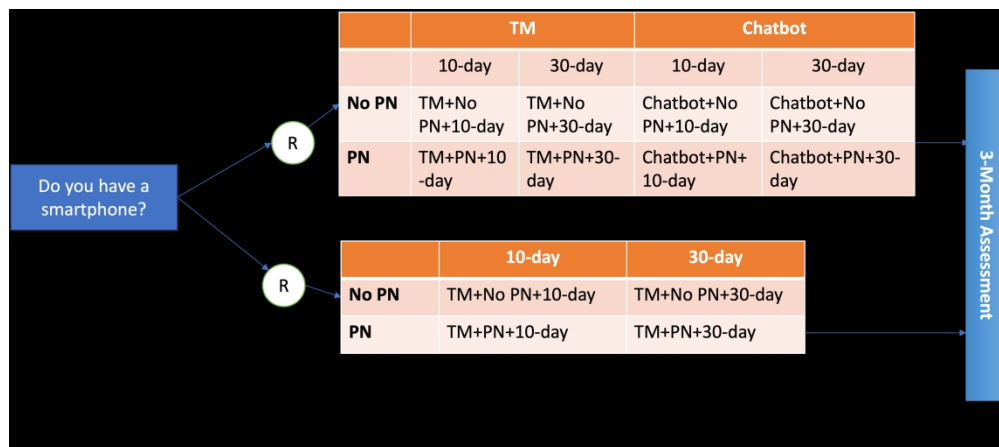


Figure 1 – SCALE-UP II Trial Design

327x144mm (300 x 300 DPI)

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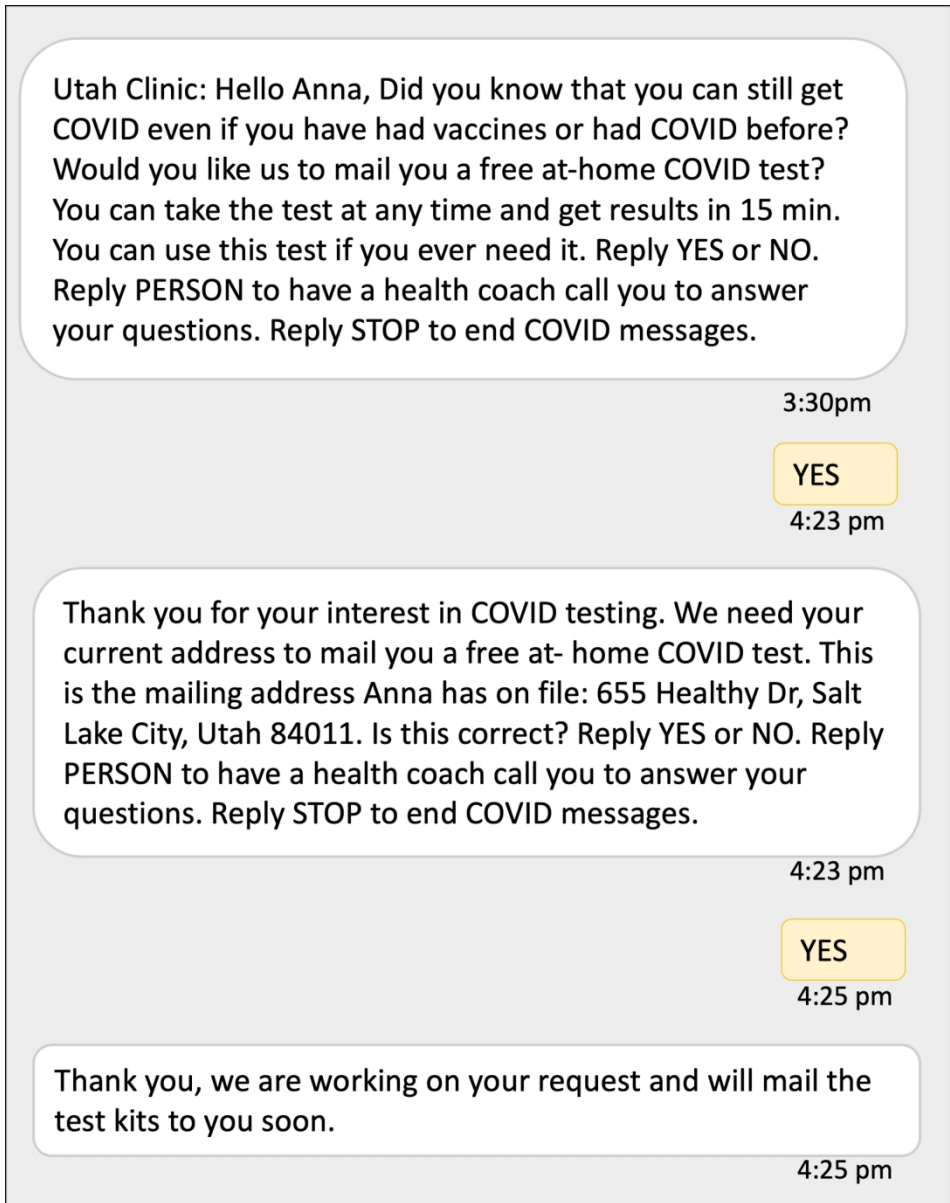


Figure 2 – Sample text message conversation offering COVID-19 at-home testing.

149x188mm (300 x 300 DPI)

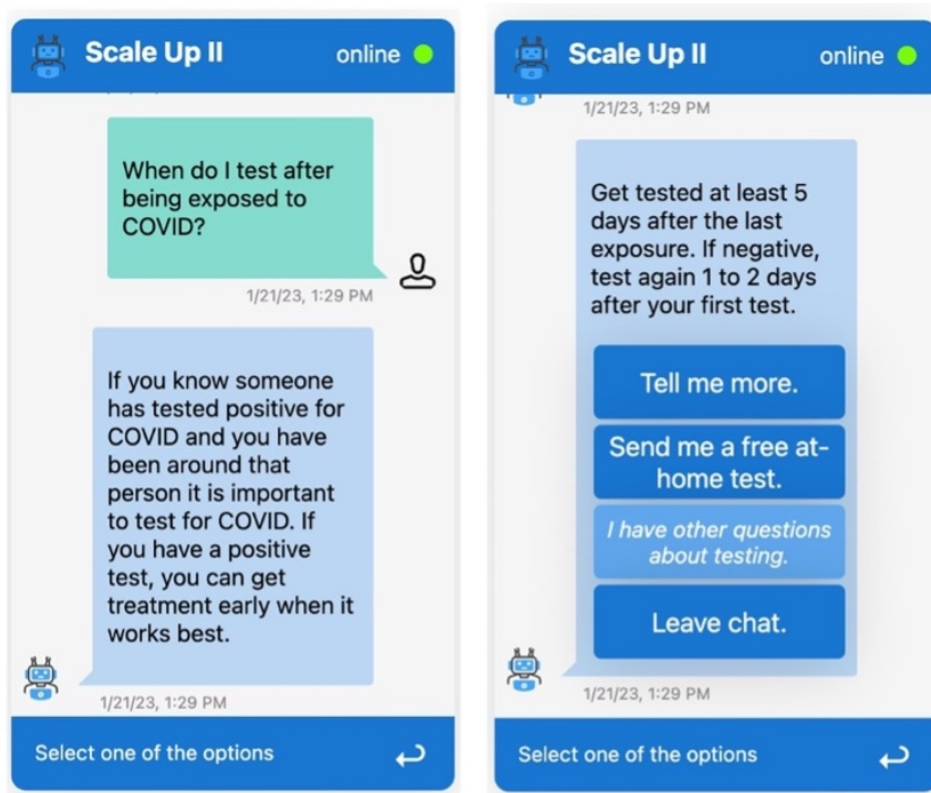


Figure 3 – Sequential screenshot of chatbot intervention showing a question being answered, followed by options to ask further questions, and request a COVID-19 test kit to be mailed to the patient's home.

101x81mm (220 x 220 DPI)

Reporting checklist for protocol of a clinical trial.

Based on the SPIRIT guidelines.

Instructions to authors

Complete this checklist by entering the page numbers from your manuscript where readers will find each of the items listed below.

Your article may not currently address all the items on the checklist. Please modify your text to include the missing information. If you are certain that an item does not apply, please write "n/a" and provide a short explanation.

Upload your completed checklist as an extra file when you submit to a journal.

In your methods section, say that you used the SPIRIT reporting guidelines, and cite them as:

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		Reporting Item	Page Number
Administrative information			
Title	#1	Descriptive title identifying the study design, population, interventions, and, if applicable, trial acronym	1
Trial registration	#2a	Trial identifier and registry name. If not yet registered, name of intended registry	2
Trial registration: data set	#2b	All items from the World Health Organization Trial Registration Data Set	2
Protocol version	#3	Date and version identifier	2
Funding	#4	Sources and types of financial, material, and other support	18
Roles and responsibilities: contributorship	#5a	Names, affiliations, and roles of protocol contributors	1

1	Roles and	#5b	Name and contact information for the trial sponsor	18
2	responsibilities:			
3	sponsor contact			
4	information			
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8	Roles and	#5c	Role of study sponsor and funders, if any, in study design;	18
9	responsibilities:		collection, management, analysis, and interpretation of data;	
10	sponsor and funder		writing of the report; and the decision to submit the report for	
11			publication, including whether they will have ultimate authority	
12			over any of these activities	
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16	Roles and	#5d	Composition, roles, and responsibilities of the coordinating centre,	NA
17	responsibilities:		steering committee, endpoint adjudication committee, data	
18	committees		management team, and other individuals or groups overseeing the	
19			trial, if applicable (see Item 21a for data monitoring committee)	
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23	Introduction			
24				
25	Background and	#6a	Description of research question and justification for undertaking	4 and 5
26	rationale		the trial, including summary of relevant studies (published and	
27			unpublished) examining benefits and harms for each intervention	
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30	Background and	#6b	Explanation for choice of comparators	5-7
31	rationale: choice of			
32	comparators			
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36	Objectives	#7	Specific objectives or hypotheses	12
37				
38	Trial design	#8	Description of trial design including type of trial (eg, parallel	5
39			group, crossover, factorial, single group), allocation ratio, and	
40			framework (eg, superiority, equivalence, non-inferiority,	
41			exploratory)	
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45	Methods:			
46	Participants,			
47	interventions, and			
48	outcomes			
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52	Study setting	#9	Description of study settings (eg, community clinic, academic	7
53			hospital) and list of countries where data will be collected.	
54			Reference to where list of study sites can be obtained	
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57	Eligibility criteria	#10	Inclusion and exclusion criteria for participants. If applicable,	7
58			eligibility criteria for study centres and individuals who will	
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perform the interventions (eg, surgeons, psychotherapists)

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3	Interventions:	#11a	Interventions for each group with sufficient detail to allow
4	description		replication, including how and when they will be administered
5			
6	Interventions:	#11b	Criteria for discontinuing or modifying allocated interventions for a
7	modifications		given trial participant (eg, drug dose change in response to harms,
8			participant request, or improving / worsening disease)
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11	Interventions:	#11c	Strategies to improve adherence to intervention protocols, and any
12	adherence		procedures for monitoring adherence (eg, drug tablet return;
13			laboratory tests)
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16	Interventions:	#11d	Relevant concomitant care and interventions that are permitted or
17	concomitant care		prohibited during the trial
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19			
20			
21	Outcomes	#12	Primary, secondary, and other outcomes, including the specific
22			measurement variable (eg, systolic blood pressure), analysis metric
23			(eg, change from baseline, final value, time to event), method of
24			aggregation (eg, median, proportion), and time point for each
25			outcome. Explanation of the clinical relevance of chosen efficacy
26			and harm outcomes is strongly recommended
27			
28			
29			
30	Participant timeline	#13	Time schedule of enrolment, interventions (including any run-ins
31			and washouts), assessments, and visits for participants. A
32			schematic diagram is highly recommended (see Figure)
33			
34			
35			
36	Sample size	#14	Estimated number of participants needed to achieve study
37			objectives and how it was determined, including clinical and
38			statistical assumptions supporting any sample size calculations
39			
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41	Recruitment	#15	Strategies for achieving adequate participant enrolment to reach
42			target sample size
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**Methods: Assignment
of interventions (for
controlled trials)**

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50	Allocation: sequence	#16a	Method of generating the allocation sequence (eg, computer-
51	generation		generated random numbers), and list of any factors for
52			stratification. To reduce predictability of a random sequence,
53			details of any planned restriction (eg, blocking) should be provided
54			in a separate document that is unavailable to those who enrol
55			participants or assign interventions
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1	Allocation concealment	#16b	Mechanism of implementing the allocation sequence (eg, central	7-8
2	mechanism		telephone; sequentially numbered, opaque, sealed envelopes),	
3			describing any steps to conceal the sequence until interventions are	
4			assigned	
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8	Allocation:	#16c	Who will generate the allocation sequence, who will enrol	7-8
9	implementation		participants, and who will assign participants to interventions	
10				
11	Blinding (masking)	#17a	Who will be blinded after assignment to interventions (eg, trial	7-8
12			participants, care providers, outcome assessors, data analysts), and	
13			how	
14				
15				
16				
17	Blinding (masking):	#17b	If blinded, circumstances under which unblinding is permissible,	NA
18	emergency unblinding		and procedure for revealing a participant's allocated intervention	
19			during the trial	
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22	Methods: Data			
23	collection,			
24	management, and			
25	analysis			
26				
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29	Data collection plan	#18a	Plans for assessment and collection of outcome, baseline, and other	13-15
30			trial data, including any related processes to promote data quality	
31			(eg, duplicate measurements, training of assessors) and a	
32			description of study instruments (eg, questionnaires, laboratory	
33			tests) along with their reliability and validity, if known. Reference	
34			to where data collection forms can be found, if not in the protocol	
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39	Data collection plan:	#18b	Plans to promote participant retention and complete follow-up,	13-15
40	retention		including list of any outcome data to be collected for participants	
41			who discontinue or deviate from intervention protocols	
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43				
44	Data management	#19	Plans for data entry, coding, security, and storage, including any	13-15
45			related processes to promote data quality (eg, double data entry;	
46			range checks for data values). Reference to where details of data	
47			management procedures can be found, if not in the protocol	
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51	Statistics: outcomes	#20a	Statistical methods for analysing primary and secondary outcomes.	12-17
52			Reference to where other details of the statistical analysis plan can	
53			be found, if not in the protocol	
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56	Statistics: additional	#20b	Methods for any additional analyses (eg, subgroup and adjusted	12-17
57	analyses		analyses)	
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1	Statistics: analysis	#20c	Definition of analysis population relating to protocol non-	16
2	population and missing		adherence (eg, as randomised analysis), and any statistical methods	
3	data		to handle missing data (eg, multiple imputation)	
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6	Methods: Monitoring			
7				
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9	Data monitoring:	#21a	Composition of data monitoring committee (DMC); summary of its	NA
10	formal committee		role and reporting structure; statement of whether it is independent	
11			from the sponsor and competing interests; and reference to where	
12			further details about its charter can be found, if not in the protocol.	
13			Alternatively, an explanation of why a DMC is not needed	
14				
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17	Data monitoring:	#21b	Description of any interim analyses and stopping guidelines,	NA
18	interim analysis		including who will have access to these interim results and make	
19			the final decision to terminate the trial	
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22	Harms	#22	Plans for collecting, assessing, reporting, and managing solicited	NA
23			and spontaneously reported adverse events and other unintended	
24			effects of trial interventions or trial conduct	
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28	Auditing	#23	Frequency and procedures for auditing trial conduct, if any, and	NA
29			whether the process will be independent from investigators and the	
30			sponsor	
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33	Ethics and			
34	dissemination			
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37	Research ethics	#24	Plans for seeking research ethics committee / institutional review	5
38	approval		board (REC / IRB) approval	
39				
40				
41	Protocol amendments	#25	Plans for communicating important protocol modifications (eg,	5
42			changes to eligibility criteria, outcomes, analyses) to relevant	
43			parties (eg, investigators, REC / IRBs, trial participants, trial	
44			registries, journals, regulators)	
45				
46				
47	Consent or assent	#26a	Who will obtain informed consent or assent from potential trial	7
48			participants or authorised surrogates, and how (see Item 32)	
49				
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51	Consent or assent:	#26b	Additional consent provisions for collection and use of participant	NA
52	ancillary studies		data and biological specimens in ancillary studies, if applicable	
53				
54				
55	Confidentiality	#27	How personal information about potential and enrolled participants	7
56			will be collected, shared, and maintained in order to protect	
57			confidentiality before, during, and after the trial	
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1	Declaration of interests	#28	Financial and other competing interests for principal investigators for the overall trial and each study site	18
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4	Data access	#29	Statement of who will have access to the final trial dataset, and disclosure of contractual agreements that limit such access for investigators	2
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10	Ancillary and post trial care	#30	Provisions, if any, for ancillary and post-trial care, and for compensation to those who suffer harm from trial participation	NA
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14	Dissemination policy: trial results	#31a	Plans for investigators and sponsor to communicate trial results to participants, healthcare professionals, the public, and other relevant groups (eg, via publication, reporting in results databases, or other data sharing arrangements), including any publication restrictions	NA
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21	Dissemination policy: authorship	#31b	Authorship eligibility guidelines and any intended use of professional writers	NA
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24	Dissemination policy: reproducible research	#31c	Plans, if any, for granting public access to the full protocol, participant-level dataset, and statistical code	NA
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28	Appendices			
29				
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31	Informed consent materials	#32	Model consent form and other related documentation given to participants and authorised surrogates	NA
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34	Biological specimens	#33	Plans for collection, laboratory evaluation, and storage of biological specimens for genetic or molecular analysis in the current trial and for future use in ancillary studies, if applicable	NA
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40 The SPIRIT Explanation and Elaboration paper is distributed under the terms of the Creative Commons
 41 Attribution License CC-BY-NC. This checklist was completed on 27. October 2023 using
 42 <https://www.goodreports.org/>, a tool made by the [EQUATOR Network](#) in collaboration with [Penelope.ai](#)
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BMJ Open

SCALE-UP II: Protocol for a Pragmatic Randomized Trial Examining Population Health Management Interventions to Increase the Uptake of At-Home COVID-19 Testing in Community Health Centers

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Primary Subject Heading:	Health informatics

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Secondary Subject Heading:	Health services research, Infectious diseases, Public health
Keywords:	COVID-19, Health Equity, Health informatics < BIOTECHNOLOGY & BIOINFORMATICS, Information technology < BIOTECHNOLOGY & BIOINFORMATICS, Public health < INFECTIOUS DISEASES



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3 SCALE-UP II: Protocol for a Pragmatic Randomized Trial Examining Population Health Management
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5 Interventions to Increase the Uptake of At-Home COVID-19 Testing in Community Health Centers
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ABSTRACT

Introduction. SCALE-UP II aims to investigate the effectiveness of population health management interventions using text messaging (TM), chatbots, and patient navigation (PN) in increasing the uptake of at-home COVID-19 testing among patients in historically marginalized communities, specifically those receiving care at community health centers (CHCs).

Methods and Analysis. The trial is a multi-site, randomized pragmatic clinical trial. Eligible patients are ≥ 18 years old with a primary care visit in the last three years at one of the participating CHCs. Demographic data will be obtained from CHC electronic health records. Patients will be randomized to one of two factorial designs based on smartphone ownership. Patients who self-report replying to a text message that they have a smartphone will be randomized in a 2x2x2 factorial fashion to receive (i) chatbot or TM; (ii) PN (yes or no); and (iii) repeated offers to interact with the interventions every 10 or 30 days. Participants who do not self-report as having a smartphone will be randomized in a 2x2 factorial fashion to receive (i) TM with or without PN; and (ii) repeated offers every 10 or 30 days. The interventions will be sent in English or Spanish, with an option to request at-home COVID-19 test kits. The primary outcome is the proportion of participants using at-home COVID-19 tests during a 90-day follow-up. The study will evaluate main effects and interactions among interventions, implementation outcomes, and predictors and moderators of study outcomes. Statistical analyses will include logistic regression, stratified subgroup analyses, and adjustment for stratification factors.

Ethics and dissemination: The protocol was approved by the University of Utah Institutional Review Board. On completion, study data will be made available in compliance with National Institutes of Health data sharing policies. Results will be disseminated through study partners and peer-reviewed publications.

Trial registration: Clinicaltrials.gov (NCT05533918 and NCT05533359).

Keywords: COVID-19, digital health, health equity, population health management

Strengths and limitations of this study

Strengths

- Uses scalable population health management interventions to increase the reach and uptake of at-home COVID-19 testing.
- Dissemination strategy modalities (i.e., voice and text cellphones) are nearly ubiquitous among adults in the United States, including among historically marginalized populations.

Limitations

- The study relies on self-reported data for its primary outcome (use of at-home testing).
- Patient population will be drawn from community health centers that opted to participate in this study, all of which are located in a single state in the United States, which limits generalizability.

INTRODUCTION

Racial/ethnic minority, low socioeconomic status (SES), and rural populations suffer profound health inequities across a wide variety of conditions, including a higher rate of hospitalization and mortality due to COVID-19.[1-4] Similar inequities have been found across the US for vaccination rates between urban and rural,[5] high and low SES,[6] and White and non-White populations.[7, 8] Low vaccination rates and withdrawal of protection measures leave historically marginalized populations at high risk for local outbreaks and more contagious variants.

Although public health agencies worldwide have declared the end of the pandemic, timely testing is still important to help reduce exposure and offer timely treatment to individuals at a higher risk for severe disease. However, historically marginalized communities lacked easy and convenient access to testing throughout the COVID-19 pandemic, especially after the closure of mass test sites nationwide.[9, 10] Although several FDA-approved at-home tests are available, providing a convenient, quick and low-cost alternative for patients to test at home,[11, 12] substantial disparities exist in the use of at-home COVID-19 testing. While the use of at-home COVID-19 testing has more than tripled between the Delta and Omicron outbreaks, use of at-home testing was more than twice as high among individuals identifying as White, having high SES, and having a postgraduate degree.[13] Thus, scalable approaches are needed to promote the uptake of at-home COVID-19 testing among individuals from historically marginalized communities.

Despite evidence of a digital divide between high resource healthcare systems and low resource community health centers (CHCs),[14, 15] historically marginalized populations have almost universal access to technology such as cellphones, which provide opportunities for large scale population health management (PHM) interventions. Even in households with annual incomes less than \$30,000, 97% own a cellphone and 76% own a smartphone.[16] The SCALE-UP II trial will investigate three PHM interventions (text messaging [TM], automated chatbot, and patient navigation [PN]) to increase the reach and uptake of at-home COVID-19 testing among patients who receive care at CHCs.

METHODS AND ANALYSIS

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3 This protocol was developed using the Standard Protocol Items: Recommendations for
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This protocol was developed using the Standard Protocol Items: Recommendations for
Interventional Trials (SPIRIT).[17] The protocol was approved by the Institutional Review Board at the
University of Utah on June 10, 2022 (IRB_00150669). The trial was registered with Clinicaltrials.gov
(NCT05533359 for patients self-reporting that they have a smartphone and NCT05533918 for all other
patients) on September 9, 2022. Enrollment was planned to begin in December 2022 and data collection
was planned to end in November 2023.

Patient and Public Involvement

SCALE-UP II is conducted in partnership with the Association for Utah Community Health
(AUCH), CHCs across Utah, the Utah Department of Health and Human Services (UDHHS), and the
University of Utah. Our research-practice partnership uses a multi-pronged community engagement
approach to (i) identify research questions, (ii) develop, adapt, and implement interventions, and (iii)
inform dissemination plans.[18, 19] The community engagement approach includes a weekly project
meeting with AUCH, UDHHS, and the research team and quarterly Patient Advisory Committee (PAC;
consisting of CHC patient representatives) and Study Advisory Committee (SAC; consisting of patients,
CHC staff, UDHHS, and AUCH representatives) meetings. The research objectives of SCALE-UP II
were identified in partnership with AUCH and UDHHS; both AUCH and UDHHS were interested in
addressing the impact of COVID-19 among historically marginalized communities in Utah. Input from
the PAC informed the design of the text messaging and chatbot interventions. Furthermore, TM and
Chatbot scripts were developed following information gathered from community members in Utah.

Study Design

SCALE-UP II is an individually randomized, multi-site, pragmatic clinical trial. The experimental
design varies according to each patient's response to a text message asking if they have a smartphone.
Participants who self-report that they have a smartphone will be randomized in a 2x2x2 factorial fashion
to receive (i) chatbot or TM; (ii) PN (yes or no); and (iii) repeated offers to interact with the interventions
every 10 or 30 days. Participants who do not respond to the introductory text message or who self-report

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3 as not having a smartphone will be randomized in a 2x2 factorial fashion to receive (i) TM with or
4 without PN; and (ii) repeated offers every 10 or 30 days.
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10 Figure 1 – SCALE-UP II Trial Design.

11 **Rationale for Study Design**

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13 The interventions in SCALE-UP II interventions leverage (i) wide adoption of electronic health
14 record (EHR) systems, even in low resource CHCs;[20, 21] (ii) wide adoption of cellphones with at least
15 voice and text capabilities;[16] and (iii) the low cost, efficiency, and simplicity of at-home COVID-19
16 tests.[11, 12] Therefore, SCALE-UP II is designed to maximize reach with low-cost interventions to
17 increase the uptake of COVID-19 testing in historically marginalized communities.
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24 SCALE-UP II will enroll patients from Utah CHCs. These settings provide primary care to
25 diverse, low SES populations, and provide an ideal setting to address COVID-19 because there is an
26 established relationship and coordination of care, and ~80% of individuals see a primary care provider at
27 least annually.[22] Three Utah CHC systems and their 12 primary care clinics will participate in SCALE-
28 UP II. Demographics of SCALE-UP II CHC patients include: 51% Latino, 62% \leq 100% federal poverty
29 level, 69% uninsured, and receiving care in clinics where 17% are in rural/frontier areas.[23]
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37 Since the chatbot requires a smartphone with connection to the internet, and about 25% of
38 individuals with low SES and from rural areas do not have a smartphone,[16] SCALE-UP II will enroll
39 patients in one of two factorial designs based on their smartphone ownership in order to maximize reach
40 to the 96% of individuals who own at least a voice and text cellphone.
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45 Patients may be reluctant to test due to hesitancy and numerous other barriers.[24, 25] However,
46 practical advice from patient navigators such as community health workers can help overcome hesitancy
47 and engagement barriers such as logistics, transportation, and expense; of critical importance, providers
48 welcome the use of these approaches with their patients.[26-28] Thus, in addition to the TM and chatbot
49 interventions, SCALE-UP II will examine the added effect of offering access to patient navigation upon
50 request through either intervention. Since patient navigation is a human-intensive intervention, examining
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3 the uptake of patient navigation when provided only upon request is critical for conserving resources in
4 limited resource settings such as CHCs.
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7 **Participants**

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9 The study inclusion criteria aim to enroll a broad range of individuals to maximize reach. Eligible
10 patients will be those who (i) have been seen at one of the participating CHCs in the last three years, (ii)
11 are 18 years and older, (iii) have a working cellphone listed in the CHC EHR, and (iv) indicate a language
12 preference in the EHR of English or Spanish.
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18 The study will exclude participants who opt out upon receipt of the introductory message asking
19 about smartphone ownership. Also, if more than one patient shares the same smartphone number in the
20 EHR, only the patient with the most recent documented clinical encounter will be included.
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24 **Recruitment**

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26 As a pragmatic trial with interventions that offer minimal risk, the University of Utah IRB
27 approved a waiver of consent for randomization and receipt of PHM interventions. Therefore, all
28 participants who meet eligibility criteria will be automatically enrolled in the study. All three study points
29 of contact (TM, chatbot, PN) will allow participants to opt-out through a simple reply at any time.
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61 **Randomization and Blinding**

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3 CHC and urban/rural designation of the participant's zip code according to rural-urban commuting area
4 (RUCA) codes.
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7 The study is outcome assessor and investigator blinded. Patient navigators cannot be blinded to
8 treatment assignment. Participants will be blinded to study participation.
9

10 11 **Study Interventions**

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13 Overall, all study interventions (i) are sent on behalf of the participant's clinic, (ii) offer the
14 option to request at-home mailed COVID-19 test kits at no cost for use as needed, (iii) are provided
15 automatically in English or Spanish based on the patient's preferred language in the CHC EHR, and (iv)
16 provide an option for participants to opt-out at any time (see Figures 2 and 3). Eligible patients and their
17 demographics data (e.g, name, date of birth, race, ethnicity, language, address, cellphone) will be
18 extracted from the CHC EHRs through EHR reports prior to the trial launch. Demographics data will be
19 used to determine eligibility, support study interventions, and for study analyses.
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31 Figure 2 – Sample text message conversation offering COVID-19 at-home testing.
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34 Figure 3 – Sequential screenshot of chatbot intervention showing a question being answered, followed by
35 options to ask further questions, and request a COVID-19 test kit to be mailed to the patient's home.
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37
38 Text Messaging (TM). Meta-analyses of text messaging interventions have found these
39 approaches to be promising for improving compliance with healthy behaviors and preventive care,
40 beneficial for multiple racial/ethnic groups, and inexpensive to deliver.[29-34] A US Department of
41 Health and Human Services review concluded: *With the near-ubiquitous presence of cellphones and the*
42 *rapid growth of smartphones, text messaging and other mHealth interventions can remove traditional*
43 *geographic and economic barriers to access to health information and services. The higher rates of*
44 *mobile phone ownership and use among Blacks and Hispanics, compared to Whites, are particularly*
45 *noteworthy. These interventions have the potential to improve health knowledge, behaviors, and outcomes*
46 *and, ultimately, to reduce disparities.*[34] Our own research has demonstrated that a simple, repeated
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3 offer to connect unmotivated, low-SES individuals with treatment resources resulted in 25% of
4 individuals enrolling in tobacco cessation treatment.[35] Thus, repeated prompting offering access to
5 COVID-19 testing via texts is an extremely convenient, low cost, scalable approach for increasing testing
6 uptake.
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11 TM will consist of bidirectional text messaging sent on behalf of the participant's clinic with a
12 response option for patients to request at-home mailed COVID-19 test kits at no cost (Figure 2).
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14 Participants randomized to TM+PN will also be able to reply requesting to speak with a patient navigator.
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16 Messages will be sent in English or Spanish based on the patient's language preference in the EHR.
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20 Chatbot. Chatbots are automated conversational agents designed to mimic human interaction.
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22 Chatbots are increasingly popular in various health contexts as they can be easily accessed through
23 smartphones, tablets, laptops, or desktops. Chatbots have many advantages for patient engagement,
24 including providing scripted education interactively, chunking information into small segments that are
25 easier to process, and allowing for choice in the amount of information received. Chatbots are accessible
26 to the vast majority of U.S. adults. Even in households with annual incomes less than \$30,000, 76% own
27 a smartphone.[16, 36, 37] Delivery of health services through chatbots in research contexts has been
28 successfully tested in various health domains such as mental health, asthma, diabetes management, and
29 physical activity uptake.[38] While scripted chatbots have been widely used in the COVID-19 pandemic,
30 especially to evaluate patient's eligibility for testing and vaccination,[39-44] research is needed to
31 examine their benefits in addressing COVID-19 at-home testing. In addition, there is a lack of studies that
32 investigated the design and implementation of chatbots specifically for historically marginalized
33 populations.
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47 For SCALE-UP II, we designed a scripted chatbot (i.e., predefined conversation script, and a fixed set
48 of questions and scripted answers) that presents participants with a list of topics that address most
49 common knowledge gaps and hesitancy factors related to at-home COVID-19 testing (Figure 3). The
50 chatbot script was designed and guided by findings from a national survey and in-depth interviews with
51 participants in the targeted Utah population, both conducted by our team. The following topics are
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3 covered: benefits of testing (even when already vaccinated or previously had COVID), when to test, test
4 accuracy, how to use a test, and what to do if a test is positive. Both text messaging and chatbot scripts
5 were validated through feedback from the study and patient advisory committee composed of clinical
6 staff and patients from the participating CHCs.
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11 Patients in the chatbot condition will receive a text message on behalf of their clinic offering a
12 hyperlink to access the chatbot on the phone's web browser. At any point in the chatbot, participants will
13 be able to click a button to request an at-home test kit. Participants randomized to the PN condition can
14 also click PERSON to request to speak to a patient navigator. As in TM, the chatbot is offered both in
15 English and Spanish.
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22 Patient Navigation (PN). SCALE-UP II will use community health workers (CHWs) employed
23 by AUCH as patient navigators to address practical barriers, motivation, and hesitancy to COVID-19
24 testing. To assist navigators in working with patients, CHWs will be trained in an empirically-validated
25 behavior change approach (Motivation And Problem Solving; MAPS).[45-50] MAPS is a holistic,
26 dynamic approach to behavior change that integrates two empirically validated approaches (motivational
27 interviewing[51, 52] and practical problem solving[47, 53, 54]) for helping patients engage in target
28 behaviors.[45-47, 49, 50] Importantly, MAPS addresses patients' social determinants of health, and
29 provides practical advice and connections to services whenever possible, including addressing testing
30 concerns (e.g., worries about repercussions of a positive test, infecting family members, quarantining,
31 financial). MAPS has been demonstrated to be effective in numerous randomized controlled trials with
32 respect to increasing enrollment in evidence-based interventions, as well as enhancing and maintaining
33 behavior change.[45-47, 49, 50]
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47 All SCALE-UP II navigators will receive ~20 hours of training, consistent with recommended
48 training for helpline specialists.[55] Participants randomized to the PN condition who request to speak
49 with a patient navigator will receive a phone call within 48 hours, although it is anticipated that most
50 patients would be called within the same day or in the next day. Patient navigators will make three
51 attempts to contact a participant.
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Study Roll-Out Schedule

To ensure that the interventions work properly with real patient data, a pilot study will be conducted with a random sample of patients from one of the participating CHCs both for the TM and Chatbot interventions.

For the remainder of patients, to address bottlenecks that depend on non-automated processes (e.g., mailing of test kits, patient navigation), study participants will be exposed to interventions in one of 14 weekly batches according to a pre-defined schedule, in which a cohort with a new set of participants is added to the study every week. Participants will be randomly allocated across the 14 batches, also stratified by CHC and urban vs. rural.

Every cycle starts by sending the introductory message to participants in the cohort (Day -2). Participants will have two days to respond. After that, eligible participants will be randomized into one of the two factorial designs depending on their response to the introductory message (Day 0). After randomization, participants will receive messages offering access to at-home testing once every 10 versus 30 days for 7 weeks (Days 0, 10, 20, 30, 40, 50, and 60 vs. Days 0, 30, and 60).

Outcome Assessment

The main study outcomes are described below. Table 1 provides a complete list including the primary, secondary outcomes, and implementation outcomes, as well as predictors and moderators of study outcomes.

Primary Outcomes and Hypotheses. The primary outcome is *Testing*; the proportion of study participants who use an at-home COVID-19 test at least once during the course of 90-day study follow-up as defined below. For all patients, regardless of self-report of smartphone ownership, the primary hypotheses are main effects for PN (PN > No PN), main effects for message frequency (10-day > 30-day), and that TM+PN will lead to higher *Testing* than TM. These hypotheses will be tested at an alpha of .0167, adjusted for multiple comparisons using the Bonferroni method. Because we anticipate a low sample size of smartphone self-reporters to be adequately powered, we consider Chatbot-related

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3 hypotheses as secondary. These include the hypothesis that Chatbot will lead to a higher *Testing* than TM
4 and that Chatbot+PN will lead to a higher *Testing* than Chatbot without PN. These hypotheses will be
5 tested at alpha of .05.
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9 Secondary and Implementation Outcomes. We will evaluate Chatbot+PN versus Chatbot,
10 interaction effects, and indicators of TM, Chatbot, and PN implementation among participants.
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12 Implementation outcomes measure the extent of the delivery and adaptation of intervention components,
13 including *Reach-Engage Testing* (proportion of participants who are offered at-home testing and reply to
14 the message or launch the Chatbot), *Reach-Accept Testing* (proportion of participants who are offered at-
15 home testing and reply accepting or select “Send me a test” on the Chatbot), *PN-Request* (proportion of
16 participants in the PN condition who request patient navigation), *PN-Engage* (proportion of participants
17 in the PN condition who talk to a patient navigator), and *Opt-Out* (proportion of participants who opt-
18 out). We will analyze chatbot usage patterns (e.g., time using chatbot, topics visited) as listed in Table 1.
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28 Predictors and Moderators of Study Outcomes. We will assess predictors and moderators
29 including demographics, vaccination status, and Tier 1 Common Data Elements (CDEs) used by the
30 Rapid Acceleration of Diagnostics-Underserved Populations (RADx-UP) program of the U.S. National
31 Institutes of Health (NIH).[56]
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37 Study Assessments. The primary outcome *Testing* will be collected through two methods from
38 patients who requested a test kit: (i) a brief text message sent 90 days after the first exposure to
39 interventions asking if they used the mailed COVID-19 test at least once (patients are asked to reply with
40 a single YES or NO response to the text message); and (ii) a survey sent to participants 7 days after the
41 last exposure to study interventions (Day 97). Secondary outcomes *Reach-Engage Testing*, *Reach-Accept*
42 *Testing*, *PN-Request*, *PN-Engage*, and *Opt-Out* will be obtained from computer system logs. The survey
43 will also collect Tier 1 CDEs. To complete the survey, participants will be invited via mail and text
44 message to complete a survey. Non-responders will also be called via phone to complete an interviewer-
45 administered survey. Vaccination status will be obtained from the Utah State Immunization Information
46 System (USIIS). Other predictors and moderators of study outcomes will be collected from EHR data
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(e.g., demographics) and online surveys (i.e., Tier 1 CDEs).

Table 1 - Study Assessments.

Assessment	Baseline	During exposure to interventions	Day 90 Follow-Up (via text msg)	Day 97 Follow-Up (via survey)	Description
Demographics	X			X	Age sex, race, ethnicity, preferred language, insurance status, etc.
Testing (primary outcome)			X	X	Proportion of study participants who use an at-home COVID-19 test during the course of the study
Number of tests used			X	X	Self-reported number of tests used by each study participant who requested a test.
Vaccination status	X			X	COVID-19 vaccination status according to state immunization registry
NIH RAD _x -UP CDE data elements (Tier 1)				X	Comprehensive questionnaire (234 items) including demographics, COVID testing, symptoms, health status, social determinants of health, etc.
Implementation Outcomes					
Reach-Engage Testing		X			Proportion of participants who are offered at-home testing and reply to the message or launch the chatbot
Reach-Engage Frequency		X			Number of times a participant replied to a message offering at-home testing or launched the chatbot
Reach-Accept Testing		X			Proportion of participants who are offered at-home testing and reply accepting
Reach-Engage Frequency		X			Number of times a participant replied to a

Assessment	Baseline	During exposure to interventions	Day 90 Follow-Up (via text msg)	Day 97 Follow-Up (via survey)	Description
					message/chatbot requesting at-home testing
PN-Request		X			Proportion of participants in the PN condition who request patient navigation
PN-Request Frequency		X			Number of times a participant requested to speak with a patient navigator
PN-Engage		X			Proportion of participants in the PN condition who talk to a patient navigator
PN-Engage Frequency		X			Number of times a participant spoke with a patient navigator
Opt-Out		X			Proportion of participants who opted-out
Chatbot use					
Chatbot session length		X			Amount of time spent using the chatbot in a session
Chatbot timeout		X			Proportion of chatbot sessions that timed out without reaching an endpoint (e.g., close chatbot window, request test, request to talk to patient navigator)
Chatbot actions		X			Number of chatbot topics clicked per session
Chatbot test request only		X			Proportion of chatbot session in which the only action was requesting a test
Chatbot coverage		X			Proportion of chatbot contents that are accessed per session
Chatbot topics		X			Proportion of sessions in which a specific chatbot topic is accessed

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3 Statistical Analysis. The main effects of each intervention will be evaluated using a logistic
4 regression model by regressing 90-day testing upon each of the three main effects: Chatbot (vs. TM) with
5 an indicator for self-reporting to have a smartphone, PN (vs. no PN), and outreach frequency (10 vs. 30
6 days). We will preliminarily include the pairwise interactions of the main effects, and the three-way
7 interaction to assess for any synergistic and/or antagonistic effect modifications across interventions and
8 will include any statistically significant effect modifications (i.e., interactions) in the primary analysis
9 model. The model will adjust for whether the patient self-reported having a smartphone. Estimates and
10 95% confidence intervals will be reported for each main effect and interaction effect. If an interaction
11 term was included for having evidence of an effect modification, we will report the main effects
12 separately for each level of the effect modifying intervention. The model will be run on all participants to
13 evaluate the primary hypotheses, each tested at alpha of .0167, and it will be applied to the smartphone
14 participants to evaluate the secondary hypotheses.

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16 Among the smartphone subgroup, we will fit the primary analysis model to evaluate all other
17 main effects as a secondary analysis. We will also test the added effect of PN among those randomized to
18 receive Chatbot. Among the remaining patients, we will regress 90-day testing upon PN (yes vs no) and
19 outreach frequency (10 vs 30 days). We will include an interaction if a preliminary model provides
20 evidence of an effect modification. Side-by-side, we will present the estimated effects across all patients
21 and by smartphone ownership subgroup.

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23 Handling Missing Data. The primary analysis will assume missing outcomes and covariates are
24 missing at random (MAR). Under this assumption, observed covariates can be used to explain the
25 missingness mechanism. When conditioning on observed covariates, the distribution of outcomes is
26 assumed to be similar among responders and non-responders. With this framework, we will omit missing
27 outcomes,[57] multiply impute missing covariates using a fully conditional specified model,[58] and
28 account for the multiple imputations in analysis.[59] While MAR is considered a reasonable starting point
29 assumption for missing data, it is plausible that responders and non-responders have different outcomes
30 beyond what can be adjusted by covariates (i.e., missing not at random; MNAR). We will use pattern
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3 mixture models as a sensitivity analysis to assess the robustness of conclusions under the MAR
4 assumption.[60]

7 Sample Size Justification. Power for SCALE-UP II was evaluated for a target enrollment of
8 42,000 adults aged 18 year and older who receive care at the three participating CHCs, have a valid
9 cellphone recorded in the EHR, and have English or Spanish as their preferred language in the EHR. This
10 estimate is based on the patient population that has received care at the three participating CHC within in
11 the 3 years preceding the trial and who meet the inclusion criteria. Among those patients, we anticipate
12 fewer than 10% opt outs based on prior studies using similar population health management approaches
13 with the same CHCs.[61] Based on national estimates of smartphone ownership,[62] we assume 75% will
14 have a smartphone and 10% to self-report as having a smartphone. Among these patients with a self-
15 reported smartphone, we anticipate ~375 patients in each of the eight study arms. Among patients who do
16 not self-report as having a smartphone, we expect ~8,750 patients in each of the four arms.

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28 Based on results of our previous trial using text messaging to help patients with access to
29 COVID-19 testing,[61] we estimate that TM with no PN and a 30-day outreach will have a 5% at-home
30 testing rate and that PN, Chatbot, and 10-day outreach frequency will increase the testing rate by 5% each
31 without a synergistic effect. We hypothesize the at-home testing rate to be 5% less when outreach occurs
32 every 30 days. Based on a similar trial conducted with patients from the same CHCs, we anticipate a \geq
33 40% response rate for the primary outcome.[63] Under these assumptions, with alpha adjusted to .0167,
34 and assuming the response rate is 20%, we are at least 85% powered to test these effects. In secondary
35 analyses, with alpha of .05 and a 40% response rate, we are 75% powered to detect the Chatbot main
36 effect of and 68% powered to detect the added effect of PN.

47 **Ethics and dissemination**

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49 All procedures performed in studies involving human participants will be conducted in
50 accordance with the ethical standards of the institutional research committee and with the 1964 Helsinki
51 declaration and its later amendments or comparable ethical standards. The protocol for this study was
52 approved by the University of Utah Institutional Review Board (00150669). Materials used to conduct the
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3 study are not currently publicly available. Materials may be requested by emailing the corresponding
4 author. Study results will be disseminated via peer-reviewed publications and manuscripts, as well as to
5 the health system and community partners via lay reports and presentations.
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9 **DISCUSSION**

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11 Individuals from historically marginalized communities have suffered substantial health
12 inequities throughout the COVID-19 pandemic, not only in terms of outcomes but also vaccination rates
13 and access to testing.[1-8, 64, 65] PHM approaches leveraging widely adopted EHR systems and
14 technology such as cellphones provide excellent opportunities to deliver scalable interventions to improve
15 health equity. The SCALE-UP II trial aims to examine scalable and sustainable PHM interventions to
16 increase the uptake of at-home COVID-19 testing among individuals who receive care from low resource
17 CHCs. Strengths include a pragmatic trial with broad inclusion criteria leveraging existing EHR data;
18 highly scalable automated interventions; and a novel design that compares two digital patient engagement
19 approaches (TM and Chatbot), examines the added effect of a human-augmented intervention (patient
20 navigation) over digital interventions, and compares two frequencies (every 10 days or 30 days) of
21 repeated offers to receive COVID-19 testing.
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35 Even though public health agencies worldwide have declared the end of the COVID-19
36 pandemic, COVID-19 testing is still critical to help reduce exposure and to identify individuals who can
37 benefit from treatment. In addition, approaches are needed to support public health preparedness for
38 future pandemics and outbreaks. The proposed interventions in SCALE-UP II leverage resources that are
39 currently available at CHCs and therefore can be sustained in the long term.
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45 **Limitations**

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47 The study design has several limitations. First, a potentially low response rate to the introductory
48 message asking about smartphone ownership could lead to a small sample size and randomization of only
49 motivated individuals to the chatbot condition. We considered randomizing all participants to Chatbot vs.
50 TM, but patients who do not have a smartphone (estimated as 25% of the CHC patient population) and
51 are randomized to the chatbot condition would not be able to use the chatbot, compromising study reach.
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3 Second, the study relies on self-report for the primary outcome with a 90-day follow-up interval (*Testing*).
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5 Patients may not recall test use and maybe less likely to self-report test use after 90 days of requesting a
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7 test. However, a 90-day follow-up was chosen to give participants sufficient time to actually use a kit,
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9 given that participants could request a test kit regardless of current symptoms and/or exposure, and use
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11 the test whenever needed. To maximize response rates, we use two approaches to collect the primary
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13 outcome: a quick question via text messaging 90 days after exposure to study interventions and a survey
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15 at the end of the study, using multiple contact attempts as well as pre- and post-participation incentives.
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18 Last, the study will be conducted after the peak of the pandemic, when participants may be less
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20 motivated to learn about and receive COVID-19 testing. Also, individuals have been overexposed to
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22 information about COVID-19 from multiple sources and may have already formed their opinions about
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24 COVID-19 and COVID-19 testing. Therefore, it is possible that study findings may not generalize to the
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26 context of new onset of a pandemic or outbreak.
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30 **Contributorship statement.** GDF, BO, TVK, JC, TG, KAK, KK, CYL, CRS, and DWW provided
31
32 substantial contributions to the conception of the study. All co-authors provided substantial contributions
33
34 to study design. GDF, BO, TVK, and JC drafted the manuscript. All co-authors reviewed the manuscript
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36 critically for important intellectual content. All co-authors provided final approval of the version to be
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38 published; and agreed to be accountable for all aspects of the work.
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44

45 **Competing interests.** The authors declare no competing interests.
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47 **Data sharing statement.** On completion, study data will be made available in compliance with National
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49 Institutes of Health data sharing policies. Results will be disseminated through study partners and peer-
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51 reviewed publications.
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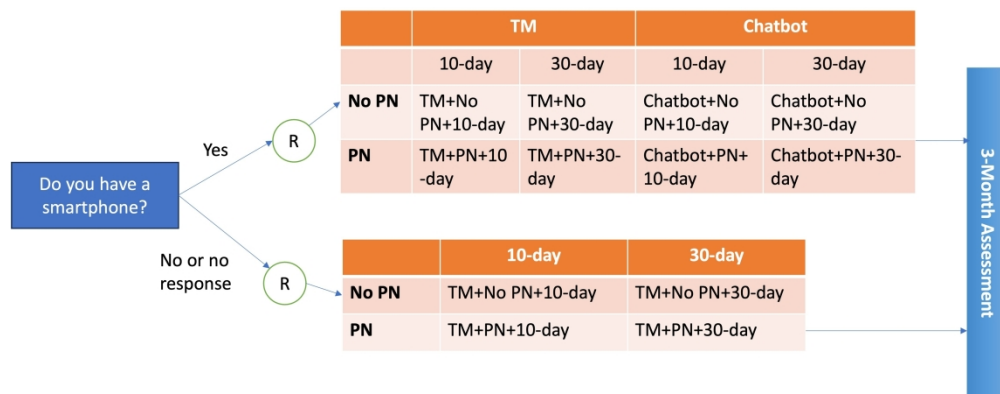
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R=randomization; PN=patient navigation; TM=text messaging

Figure 1 – SCALE-UP II Trial Design

327x144mm (300 x 300 DPI)

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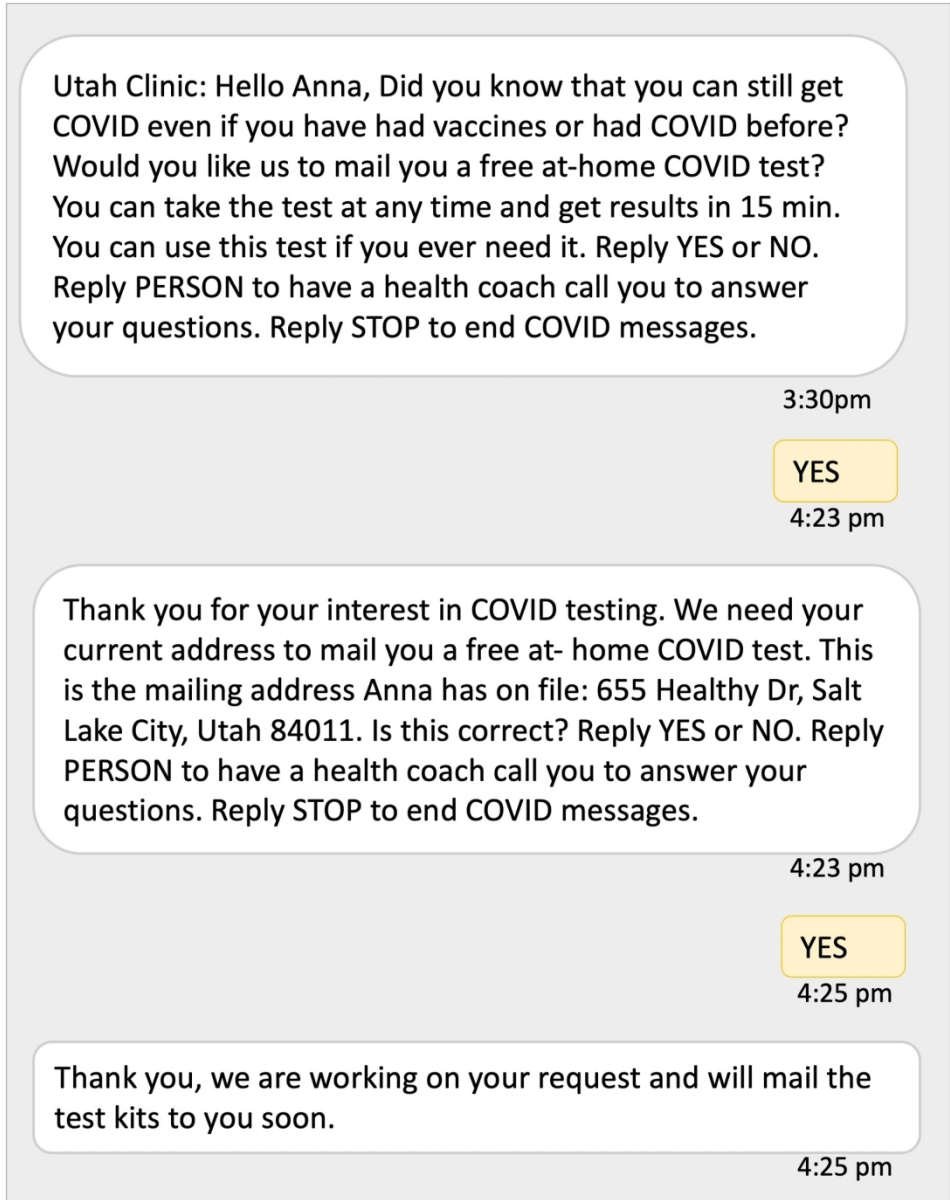


Figure 2 – Sample text message conversation offering COVID-19 at-home testing.

149x188mm (300 x 300 DPI)

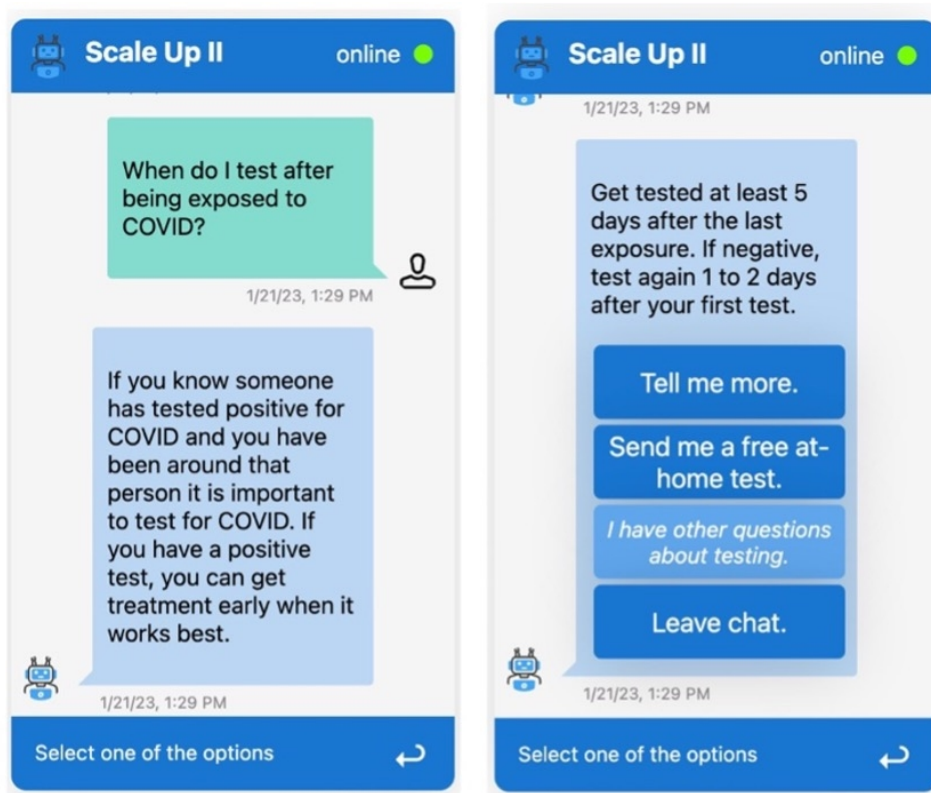


Figure 3 – Sequential screenshot of chatbot intervention showing a question being answered, followed by options to ask further questions, and request a COVID-19 test kit to be mailed to the patient’s home.

101x81mm (220 x 220 DPI)

Reporting checklist for protocol of a clinical trial.

Based on the SPIRIT guidelines.

Instructions to authors

Complete this checklist by entering the page numbers from your manuscript where readers will find each of the items listed below.

Your article may not currently address all the items on the checklist. Please modify your text to include the missing information. If you are certain that an item does not apply, please write "n/a" and provide a short explanation.

Upload your completed checklist as an extra file when you submit to a journal.

In your methods section, say that you used the SPIRIT reporting guidelines, and cite them as:

Chan A-W, Tetzlaff JM, Gøtzsche PC, Altman DG, Mann H, Berlin J, Dickersin K, Hróbjartsson A, Schulz KF, Parulekar WR, Krleža-Jerić K, Laupacis A, Moher D. SPIRIT 2013 Explanation and Elaboration: Guidance for protocols of clinical trials. *BMJ*. 2013;346:e7586

		Reporting Item	Page Number
Administrative information			
Title	#1	Descriptive title identifying the study design, population, interventions, and, if applicable, trial acronym	1
Trial registration	#2a	Trial identifier and registry name. If not yet registered, name of intended registry	2
Trial registration: data set	#2b	All items from the World Health Organization Trial Registration Data Set	2
Protocol version	#3	Date and version identifier	2
Funding	#4	Sources and types of financial, material, and other support	18
Roles and responsibilities: contributorship	#5a	Names, affiliations, and roles of protocol contributors	1

1	Roles and	#5b	Name and contact information for the trial sponsor	18
2	responsibilities:			
3	sponsor contact			
4	information			
5				
6				
7				
8	Roles and	#5c	Role of study sponsor and funders, if any, in study design;	18
9	responsibilities:		collection, management, analysis, and interpretation of data;	
10	sponsor and funder		writing of the report; and the decision to submit the report for	
11			publication, including whether they will have ultimate authority	
12			over any of these activities	
13				
14				
15				
16	Roles and	#5d	Composition, roles, and responsibilities of the coordinating	5
17	responsibilities:		centre, steering committee, endpoint adjudication committee,	
18	committees		data management team, and other individuals or groups	
19			overseeing the trial, if applicable (see Item 21a for data	
20			monitoring committee)	
21				
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23				
24	Introduction			
25				
26				
27	Background and	#6a	Description of research question and justification for undertaking	4 and 5
28	rationale		the trial, including summary of relevant studies (published and	
29			unpublished) examining benefits and harms for each intervention	
30				
31				
32	Background and	#6b	Explanation for choice of comparators	5-7
33	rationale: choice of			
34	comparators			
35				
36				
37	Objectives	#7	Specific objectives or hypotheses	12
38				
39				
40	Trial design	#8	Description of trial design including type of trial (eg, parallel	5
41			group, crossover, factorial, single group), allocation ratio, and	
42			framework (eg, superiority, equivalence, non-inferiority,	
43			exploratory)	
44				
45				
46	Methods:			
47	Participants,			
48	interventions, and			
49	outcomes			
50				
51				
52				
53	Study setting	#9	Description of study settings (eg, community clinic, academic	7
54			hospital) and list of countries where data will be collected.	
55			Reference to where list of study sites can be obtained	
56				
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59	Eligibility criteria	#10	Inclusion and exclusion criteria for participants. If applicable,	7
60				

eligibility criteria for study centres and individuals who will perform the interventions (eg, surgeons, psychotherapists)

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4	Interventions:	#11a	Interventions for each group with sufficient detail to allow
5	description		replication, including how and when they will be administered
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8	Interventions:	#11b	Criteria for discontinuing or modifying allocated interventions
9	modifications		for a given trial participant (eg, drug dose change in response to
10			harms, participant request, or improving / worsening disease)
11			
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13	Interventions:	#11c	Strategies to improve adherence to intervention protocols, and
14	adherence		any procedures for monitoring adherence (eg, drug tablet return;
15			laboratory tests)
16			
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18	Interventions:	#11d	Relevant concomitant care and interventions that are permitted
19	concomitant care		or prohibited during the trial
20			
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22	Outcomes	#12	Primary, secondary, and other outcomes, including the specific
23			measurement variable (eg, systolic blood pressure), analysis
24			metric (eg, change from baseline, final value, time to event),
25			method of aggregation (eg, median, proportion), and time point
26			for each outcome. Explanation of the clinical relevance of
27			chosen efficacy and harm outcomes is strongly recommended
28			
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32	Participant timeline	#13	Time schedule of enrolment, interventions (including any run-ins
33			and washouts), assessments, and visits for participants. A
34			schematic diagram is highly recommended (see Figure)
35			
36			
37	Sample size	#14	Estimated number of participants needed to achieve study
38			objectives and how it was determined, including clinical and
39			statistical assumptions supporting any sample size calculations
40			
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42			
43	Recruitment	#15	Strategies for achieving adequate participant enrolment to reach
44			target sample size
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**Methods: Assignment
of interventions (for
controlled trials)**

51			
52	Allocation: sequence	#16a	Method of generating the allocation sequence (eg, computer-
53	generation		generated random numbers), and list of any factors for
54			stratification. To reduce predictability of a random sequence,
55			details of any planned restriction (eg, blocking) should be
56			provided in a separate document that is unavailable to those who
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		enrol participants or assign interventions	
1			
2	Allocation	#16b Mechanism of implementing the allocation sequence (eg, central	7-8
3	concealment	telephone; sequentially numbered, opaque, sealed envelopes),	
4	mechanism	describing any steps to conceal the sequence until interventions	
5		are assigned	
6			
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8			
9	Allocation:	#16c Who will generate the allocation sequence, who will enrol	7-8
10	implementation	participants, and who will assign participants to interventions	
11			
12			
13	Blinding (masking)	#17a Who will be blinded after assignment to interventions (eg, trial	7-8
14		participants, care providers, outcome assessors, data analysts),	
15		and how	
16			
17			
18	Blinding (masking):	#17b If blinded, circumstances under which unblinding is permissible,	NA
19	emergency unblinding	and procedure for revealing a participant's allocated intervention	
20		during the trial	
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23			
24	Methods: Data		
25	collection,		
26	management, and		
27	analysis		
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30	Data collection plan	#18a Plans for assessment and collection of outcome, baseline, and	13-15
31		other trial data, including any related processes to promote data	
32		quality (eg, duplicate measurements, training of assessors) and a	
33		description of study instruments (eg, questionnaires, laboratory	
34		tests) along with their reliability and validity, if known.	
35		Reference to where data collection forms can be found, if not in	
36		the protocol	
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42	Data collection plan:	#18b Plans to promote participant retention and complete follow-up,	13-15
43	retention	including list of any outcome data to be collected for participants	
44		who discontinue or deviate from intervention protocols	
45			
46			
47	Data management	#19 Plans for data entry, coding, security, and storage, including any	13-15
48		related processes to promote data quality (eg, double data entry;	
49		range checks for data values). Reference to where details of data	
50		management procedures can be found, if not in the protocol	
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53			
54	Statistics: outcomes	#20a Statistical methods for analysing primary and secondary	12-17
55		outcomes. Reference to where other details of the statistical	
56		analysis plan can be found, if not in the protocol	
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1	Statistics: additional	#20b	Methods for any additional analyses (eg, subgroup and adjusted	12-17
2	analyses		analyses)	
3				
4	Statistics: analysis	#20c	Definition of analysis population relating to protocol non-	16
5	population and missing		adherence (eg, as randomised analysis), and any statistical	
6	data		methods to handle missing data (eg, multiple imputation)	
7				
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9				
10	Methods: Monitoring			
11				
12	Data monitoring:	#21a	Composition of data monitoring committee (DMC); summary of	NA
13	formal committee		its role and reporting structure; statement of whether it is	
14			independent from the sponsor and competing interests; and	
15			reference to where further details about its charter can be found,	
16			if not in the protocol. Alternatively, an explanation of why a	
17			DMC is not needed	
18				
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22	Data monitoring:	#21b	Description of any interim analyses and stopping guidelines,	NA
23	interim analysis		including who will have access to these interim results and make	
24			the final decision to terminate the trial	
25				
26				
27	Harms	#22	Plans for collecting, assessing, reporting, and managing solicited	NA
28			and spontaneously reported adverse events and other unintended	
29			effects of trial interventions or trial conduct	
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33	Auditing	#23	Frequency and procedures for auditing trial conduct, if any, and	NA
34			whether the process will be independent from investigators and	
35			the sponsor	
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38	Ethics and			
39	dissemination			
40				
41				
42	Research ethics	#24	Plans for seeking research ethics committee / institutional review	5
43	approval		board (REC / IRB) approval	
44				
45				
46	Protocol amendments	#25	Plans for communicating important protocol modifications (eg,	5
47			changes to eligibility criteria, outcomes, analyses) to relevant	
48			parties (eg, investigators, REC / IRBs, trial participants, trial	
49			registries, journals, regulators)	
50				
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52				
53	Consent or assent	#26a	Who will obtain informed consent or assent from potential trial	7
54			participants or authorised surrogates, and how (see Item 32)	
55				
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57	Consent or assent:	#26b	Additional consent provisions for collection and use of	7
58	ancillary studies		participant data and biological specimens in ancillary studies, if	
59				
60				

applicable

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3	Confidentiality	#27	7
4		How personal information about potential and enrolled	
5		participants will be collected, shared, and maintained in order to	
6		protect confidentiality before, during, and after the trial	
7			
8	Declaration of interests	#28	18
9		Financial and other competing interests for principal	
10		investigators for the overall trial and each study site	
11			
12	Data access	#29	2
13		Statement of who will have access to the final trial dataset, and	
14		disclosure of contractual agreements that limit such access for	
15		investigators	
16			
17	Ancillary and post trial	#30	NA
18	care	Provisions, if any, for ancillary and post-trial care, and for	
19		compensation to those who suffer harm from trial participation	
20			
21	Dissemination policy:	#31a	18
22	trial results	Plans for investigators and sponsor to communicate trial results	
23		to participants, healthcare professionals, the public, and other	
24		relevant groups (eg, via publication, reporting in results	
25		databases, or other data sharing arrangements), including any	
26		publication restrictions	
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28			
29	Dissemination policy:	#31b	NA
30	authorship	Authorship eligibility guidelines and any intended use of	
31		professional writers	
32			
33	Dissemination policy:	#31c	18
34	reproducible research	Plans, if any, for granting public access to the full protocol,	
35		participant-level dataset, and statistical code	
36			
37	Appendices		
38			
39	Informed consent	#32	supplement
40	materials	Model consent form and other related documentation given to	
41		participants and authorised surrogates	
42			
43	Biological specimens	#33	NA
44		Plans for collection, laboratory evaluation, and storage of	
45		biological specimens for genetic or molecular analysis in the	
46		current trial and for future use in ancillary studies, if applicable	
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 50 <https://www.goodreports.org/>, a tool made by the [EQUATOR Network](#) in collaboration with [Penelope.ai](#)
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