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1 **Title: Usability, inclusivity, and content evaluation of COVID-19 contact tracing apps in the United**
2 **States**

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18 **Keywords:** COVID-19, contact tracing, mobile apps, digital literacy, usability

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21 **Word count:** 2192

ABSTRACT

Objective: We evaluated the usability of mobile COVID-19 contact tracing apps, especially for individuals with barriers to communication and limited digital literacy skills.

Materials and Methods: We searched the Apple App Store, Google Play, peer-reviewed literature, and lay press to find contact tracing apps in the United States. We evaluated apps with a framework focused on user characteristics and user interface.

Results: Of the final 26 apps, 77% were on both iPhone and Android. 69% exceeded 9th grade readability, and 65% were available only in English. Only 12% had inclusive illustrations (different genders, skin tones, physical abilities). 92% alerted users of an exposure, 42% linked to a testing site, and 62% linked to a public health website within 3 clicks.

Conclusion: Most apps alert users of COVID-19 exposure but require high English reading levels and are not fully inclusive of the U.S. population, which may limit their reach as public health tools.

INTRODUCTION

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3 In the United States (U.S.), contact tracing has been performed with localized, sometimes disjointed,
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5 approaches. Manual contact tracing, in which trained personnel conduct interviews with those who
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7 have tested positive for the virus (“cases”), requires a large workforce and cannot keep pace with the
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9 mounting number of COVID-19 infections.[1-3] Therefore, some states introduced contact tracing
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11 mobile applications (apps) to augment their contact tracing efforts.[4-6] It is estimated that these apps
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13 must be used by nearly 60% of the population to reduce the spread of the virus, though any use at all
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15 helps identify people with potential exposure (“contacts”).[7] Adoption of contact tracing apps is
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17 relatively high in Qatar and Iceland (91% and 40%, respectively).[5] In the U.S. and other countries,
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19 however, major issues with app adoption revolve around engagement, privacy concerns, cybersecurity,
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21 and accuracy.[6, 8-16]
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27 Many of these barriers are inextricably linked with the digital divide in the U.S., from structural
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29 to individual levels.[6, 8-16] At the structural level, there are clear disparities in smartphone ownership
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31 and broadband/high speed Internet access.[17] At the individual level, even among those with existing
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33 devices and sufficient Internet access, digital literacy skills and app use vary among consumers. Experts
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35 define digital engagement as “how well users can use a product to achieve their goals and how satisfied
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37 they are with that process.”[18] Therefore, it is clear that contact tracing apps can only achieve
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39 widespread use if they are usable by diverse populations, especially considering the disproportionate
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41 number of COVID-19 infections in low-income, non-white populations.
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47 Several studies have assessed national contact tracing apps, along with COVID symptom-tracking
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49 or informational apps.[5, 9, 19-23] These studies evaluated apps with various frameworks in the
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51 following general categories: accessibility, functionality, engagement, aesthetics, and inclusion of
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53 resources and information.[5, 9, 19-23] They were not specific to common health communication
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55 barriers and diversity or inclusion concepts, which were our focus here. Other usability frameworks,
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57 such as Nielsen’s or Kientz’s, similarly encompass these broad, subjective categories.[24, 25] No study to
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1 our knowledge has evaluated COVID-19 contact tracing apps in the U.S. with objective measures
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3 specifically focused on health communication barriers or diversity of end users.
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7 **OBJECTIVE**

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10 We present an evaluation framework with objective measures usability with respect to health
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12 communication and diversity/inclusivity. We use this framework to evaluate COVID-19 contact tracing
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14 apps available in the U.S. Finally, we present suggestions on how app developers can improve the fit
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16 between apps and user needs.
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22 **METHODS**

23 **Sample**

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27 To identify COVID-19 contact tracing apps, we searched the Apple App Store and Google Play using
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29 search terms “covid-19,” “coronavirus,” “exposure notification,” and “contact tracing.” To be thorough,
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31 we also searched for publications in PubMed and medRxiv using “(covid* OR coronavirus OR contact
32
33 tracing) AND (app OR apps)”. Finally, we searched mass media publications using a Google Search with
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35 search terms “covid app,” “contact tracing app,” and “coronavirus exposure notification.” However, all
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37 the apps we evaluated came from app store searches. We searched between October 6 and November
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39 12, 2020.
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44 We excluded apps for the following reasons: developed with a target audience outside the U.S.,
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46 only included mapping of population-level COVID-19 information (no individual contact tracing
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48 functionality), restricted to members of a specific institution, or required scanning physical Quick
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50 Response (QR) codes. Apps requiring an email to register were also excluded, given privacy concerns.
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52 Cost was not a factor, as all remaining identified apps were free to use.
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56 **Measures**

1 This study focused on usability within two domains of the FDA Applying Human Factors and Usability
2 Engineering to Medical Devices guidance framework: 1) “user characteristics” with careful expansion
3 within this domain to define categories related to health communication, such as readability and
4 language; and 2) “user interface” with a focus on specific elements in this domain related to audiovisual
5 information (including racial and gender diversity within visual elements) and functionality/logic of
6 information presented (such as number of clicks and provided resources).[26] The “user environment”
7 within this FDA framework was not evaluated specifically, as we limited our evaluation to upfront
8 engagement in the apps rather than completion of the contact tracing process.[26]
9

10 Focusing on “user characteristics” and “user interface and functionality” domains of the FDA
11 framework for this analysis allowed the study team to narrow in on elements related to accessibility and
12 inclusivity; we anticipate that other research may examine additional, broader usability aspects such as
13 type of exposure notification. More specifically, we combined this framework with concepts from
14 multiple published studies outlining health communication and diversity barriers related to technology
15 use, resulting in a 14-item evaluation framework (see **Table 2** for details).[5, 9, 19-32] Five of these items
16 were more closely related to “user characteristics,” such as readability, while the remaining items and
17 our clickability evaluation were more related to “user interface” and functionality.
18

19 **Analysis**

20 One author (SB) primarily evaluated apps using an iPhone 7. A second coder (SL) used an iPhone
21 8 to independently assess 5 (20%) of the apps to ensure reproducibility of coding. We downloaded 50%
22 of apps evaluated on the iPhone onto an Android (Samsung Galaxy J3) to verify the same functionalities
23 and appearances on Android as on iPhone (with no differences to note, data not shown).
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25 We scored apps in each category and recorded the data in Microsoft Excel. For the majority of
26 coding, we categorized apps either dichotomously as yes/no (e.g., app has audio or visual components)
27 or into discrete groups (e.g., readability level at <6th grade, 6th-9th grade, or >9th grade). For six pre-
28 specified functions, we recorded the number of clicks to reach the target feature or content. Finally, we
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1 selected three apps that provided concrete examples of several user and user interface domains that
2 could be considered in future app designs: 1) written at lower reading levels; 2) used racially and gender
3 diverse visual features; 3) included audiovisual components.
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10 RESULTS

11 The initial search yielded 54 apps related to contact tracing in the U.S. After applying our exclusion
12 criteria, we evaluated 26 apps (**Figure 1**). The coding was highly consistent between coders, with a range
13 of Cohen's Kappa between the categories of 0.95 to 1.0. State and county government-affiliated entities
14 created 19/26 (73%) of the apps, but notably Apple and Google jointly created the Exposure Notification
15 Express system, which they embedded in the operating systems without a corresponding app on iPhone
16 (**Table 1, Figure 2**). Most apps (20/26, 77%) were available on both iPhone and Android (**Table 1, Table**
17 **2**). Public health departments in some regions (CO, DC, CA, MD, CT, and WA) only provided Android
18 apps, but all of those states were also available in the Exposure Notifications Express system in iPhone
19 Settings (**Table 1**).
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34 Overall, 18/26 (69%) were above 9th grade readability and 17/26 (65%) were available only in
35 English (**Table 2**). 5/26 (19%) were available in more than three languages, including Spanish (**Table 2**).
36 22/26 (85%) did not require users to input a phone number to sign up (**Table 2**). Regarding user interface
37 and functionality, the vast majority of apps directly alerted users of an exposure and explained how their
38 alert system worked, but only 8/26 (31%) included videos or illustrations to do so (**Table 2**). Very few
39 (3/26, 12%) included illustrations with diverse representations (different genders, skin tones, or physical
40 abilities) (**Table 2**). Though less than half provided links to find physical testing locations, 16/26 (62%)
41 linked to a local or state health department website within 3 clicks (**Table 2, Figure 3**). 22/26 (85%)
42 verified a user-reported positive test with local health authorities (data not shown). None of the apps
43 provided direct links to social support services or resources for quarantining (**Table 2**).
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Table 1. The 26 contact tracing apps in the United States that were evaluated.

Letter	Application (device on which it was evaluated)	Developer	Update Date	iPhone rating (reviews)	Google Play rating (reviews)	Google Play # of downloads
A	COVID Alert NY (iPhone)	New York State Department of Health	10/7/20	4.8 (408)	4 (751)	100000+
B	COVID Alert NJ (iPhone)	New Jersey Office of Information Technology	10/14/20	3.8 (214)	3.9 (296)	100000+
C	COVIDWISE (VA) (iPhone)	Virginia Department of Health	8/27/20	4.7 (823)	3.7 (834)	100000+
D	SlowCOVIDNC (iPhone)	NC Department of Health and Human Services	10/7/20	4.8 (176)	3.9 (314)	100000+
E	COVID Alert Pennsylvania (iPhone)	Commonwealth of Pennsylvania	10/1/20	4.4 (213)	4.0 (539)	100000+
F	Care19 Alert (ND and WY) (iPhone)	ProudCrowd, LLC	10/24/20	4.3 (20)	3.3 (46)	10000+
G	COVID Trace Nevada (iPhone)	Nevada Division of Public and Behavioral Health	10/2/20	3.2 (106)	3.6 (96)	10000+
H	Covid Watch Arizona (iPhone)	Arizona Department of Health Services	10/14/20	4.3 (54)	4.0 (28)	5000+
I	COVID Alert DE (iPhone)	Delaware Division of Public Health	10/1/20	4.4 (24)	4.2 (59)	10000+
J	GuideSafe (Alabama) (iPhone)	Alabama Department of Public Health	9/27/20	4.6 (80)	3.4 (126)	50000+
K	Citizen SafePass (San Joaquin County) (iPhone)	sp0n, Inc.	9/27/20	2.5 (106)	(0)	50+
L	PathCheck SafePlaces (Haiti, Guam, Puerto Rico, Teton County WY) (iPhone)	Path Check, Inc.	8/27/20	4.5 (55)	4.1 (70)	10000+
M	COVID Control (iPhone)	Johns Hopkins Mobile Medicine	8/27/20	4.6 (30)	3.2 (20)	1000+
N	CheckCOVID (iPhone)	University of Nebraska Medical Center	10/7/20	4.5 (74)	(1)	1000+
O	MI COVID Alert (iPhone)	State of Michigan - Department of Technology	10/21/20	4.9 (64)	4.7 (35)	5000+
P	SC Safer Together (iPhone)	Medical University of South Carolina	11/13/20	4.7 (7)	(0)	5+
Q	CombatCOVID MDC (iPhone)	County Government of Miami-Dade County, Florida	10/26/20	3.4 (48)	4.5 (23)	1000+
R	CombatCOVID PBC (iPhone)	County Government of Palm Beach County, Florida	9/27/20	3.5 (17)	3.7 (37)	1000+
S	Exposure Notifications Express* (PA, NY, MI, VA, NV, AL, ND, WY, DC, NC, CO, MD, CT) (iPhone)	Apple/Google	9/1/20	-	-	-
T	CO Exposure Notifications (Android)	Colorado Department of Public Health & Environment	10/23/20	-	4.6 (163)	50000+
U	DC CAN (Android)	Government of the District of Columbia	10/23/20	-	4.2 (35)	5000+
V	CA Notify (Early Access) (Android)	California Department of Technology	11/10/20	-	(0)	5000+
W	MD COVID Alert (Android)	Maryland Department of Health	11/10/20	-	4.0 (91)	50000+
X	COVID Alert CT (Android)	Connecticut Department of Public Health	11/9/20	-	4.0 (66)	10000+
Y	WA Notify (Early Access) (Android)	Washington Department of Health	10/29/20	-	(0)	100+
Z	AlohaSafe Alert (iPhone)	Hawaii State Department of Health	11/12/20	5 (5)	(0)	100+

*Exposure Notifications Express refers to the iPhone-integrated system that can be accessed from iPhone Settings. The listed states enabled this method for contact tracing. The corresponding system on Android has generated apps, which were evaluated separately (see T-Y). Therefore, some apps on Android do not have corresponding apps on iPhone.

Table 2. Evaluation framework and results for the apps.

Feature	Number of apps with feature, N (%)	List of apps with feature (identified by letter, see Table 1)	Definition	Rationale
USER CHARACTERISTICS				
Readability			Readability is defined as Flesch-Kincaid Grade Level. This is a validated grade-level readability of texts, based on sentence length and number of syllables.[33] It was calculated overall from home screens and simplified privacy policy sections (comprehensive privacy policies were excluded) using Microsoft Word. Relevant categories are: <6 th grade; 6-9 th grade; >9 th grade.	The average reading level in the United States is 7 th -8 th grade, and 20% of adults cannot read above a 5 th grade level.[23] Though some of these apps had home screens with few sentences or words, their explanations of how the apps work and summaries of the privacy policy were well above 5 th grade level.
<6 th grade	0 (0)	None		
6 th -9 th grade	8 (31)	A, E, K, M, P-R, Z		
9 th -12 th grade	18 (69)	B-D, F-J, L, O, S-Y		
Language options			Apps are available in English as well as other languages. Relevant categories are: English only; English and Spanish; 3+ languages.	4.9% of United States citizens over age 18 speak English less than “very well.”[34] For these apps to have high usage rates and be efficacious, they must not exclude those who primarily speak a language other than English or cannot read English, especially given the high literacy levels already required to understand the apps.
English only	17 (65)	C, D, F-H, J, K, M-P, T-Y		
English and Spanish	4 (15)	B, E, I, Z		
3+ languages	5 (19)	A, L, Q-S		
Consistent terminology	13 (50)	B-D, F-H, J, O, P, S, W-Y	Each concept is linked to one word (as opposed to switching between terms, such as “coronavirus” and “COVID-19” or “alerts” and “notifications”).	Consistent wording aids in understanding and remembering information.
Registration not required	22 (85)	A-J, L, N-P, S-Z	Email, phone number, name, address, date of birth, and other personal identifiers are not required to use the app.	People should be able to participate in contact tracing efforts without having to share their personal information.
iPhone and Android compatible	20 (77)	A-S, Z	Apps are available on both iPhone and Android.	Apps will work best when they include as many users as possible. Limiting an app to a certain device and a certain operating system (not addressed here) limits the potential number of users and therefore its potential efficacy.
USER INTERFACE and FUNCTIONALITY				
Audio or video option	2 (8)	K, S	Audio or video is available to explain how the app works and/or to help navigate the app.	Apps should include audio or video options to assist those with communication barriers (e.g. visual impairment, limited literacy) use the app.
Illustrated instructions	6 (23)	A, B, D, H, P, Z	Instructions have illustrations alongside them.	Illustrations help convey key points.[35, 36]
Inclusive illustrations	3 (12)	A, D, Z	Illustrations or videos, if included, have various skin tones and genders represented.	Users should feel represented and valued in the app. No apps included illustrations of people with different physical abilities, so we only evaluated for skin tone and gender.
Feature to explain how exposure alerts work	20 (77)	A-K, O, S-Z	There is a “How It Works” or similar section of the app that can be accessed from the home page.	Providing a “How it Works” section accessible from the home page allows users to re-visit this information after first use. This feature may help build user trust.[15]
Directly alerts user of an exposure	24 (92)	A-L, S-Z	The app alerts the user of a potential exposure using Exposure Alerts rather than solely collecting data.	Part of contact tracing includes alerting contacts of their exposure. If the app only collects information and sends it to the associated Health Department, without alerting contacts automatically, there is a time lag between when a contact could be alerted of an exposure and when the contact is finally alerted.
Links to a COVID testing site	11 (42)	A, B, D, E, I, K, M, O-R	The app helps the user find a testing site.	In the event of an exposure, the user should be able to quickly find a testing site.
Links to comprehensive Privacy Policy	25 (92)	Within app: J, R Externally linked: A-P, R-Z	The Privacy Policy is accessible from the app without requiring the user to search for it online.	The Privacy Policy should be clearly displayed within the app. Ideally, the Privacy Policy is described in simple writing within the app. The comprehensive policy could be an external link available from the app.
Links to the local Health Department website	16 (62)	C, D, F, G, J, M-O, Q, R, U-Z	The app provides a link to the user’s local Health Department website.	The user can access further guidance and resources (for example, social support for quarantine).
Links to social support for quarantine	0 (0)	None	The app links the user to social support services, if the user requests, for quarantine or isolation support.	Users are equipped to help reduce the spread of COVID-19 if they have access to the tools they need to quarantine after an exposure alert.

Note: Any potential information that would have been made available after receiving an Exposure Alert or submitting a positive test notification was not evaluated in our study.

SlowCOVIDNC

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3 SlowCOVIDNC was launched by the North Carolina Department of Health and Human Services in
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5 September 2020. It is free and does not prompt for user registration. The app runs in the background of
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7 a user's phone and, as explained within the app, does not collect any personally identifiable information
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9 because it uses Bluetooth rather than Location sensing. Using a specific, illustrated example of two
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11 people meeting in a grocery store, the app explains its utilization of Bluetooth token exchanges to
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13 remember interactions between users exceeding 10-20 minutes. If a user tests positive and reports it in
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15 the app, the Department confirms the case before the app alerts users of an exposure. All app
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17 illustrations represent a spectrum of skin tones and of genders. However, readability level of the "How it
18
19 Works" explanation is 9.1, and the app is only available in English.
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AlohaSafe Alert

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29 AlohaSafe Alert was launched by the Hawaii State Department of Health in November 2020. It similarly
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31 does not require registration, uses Bluetooth sensing, and confirms cases before alerting contacts of
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33 exposures. When first opening the app, users choose between Spanish and English. The welcome
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35 illustration represents different skin tones and genders. A concise explanation of how the app works has
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37 a readability level of 6.0. Part of this explanation is: "In the event of an encounter, your data and
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39 information remain anonymous. The app doesn't store any personal data. Only random IDs are
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41 exchanged. These are deleted after 14 days." Within the app, however, there is some inconsistent
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43 wording, as "exposure," "detection," "alert," and "report" are used interchangeably. The app also links
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45 to the Hawaii Department of Health website, but it does not clearly present a link to access testing or
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47 provide user feedback.
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Exposure Notifications Express

1 Exposure Notifications Express was launched by Apple and Google in September 2020. It is not an app
2 on the iPhone, rather a system that can be enabled from Settings. (On Android, Google creates apps
3 corresponding to the states that opt-in to their system, and those apps were evaluated separately).
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5 Since this system is integrated with the iPhone, the user can use any language available on the iPhone
6 and enable VoiceOver for low vision. Unfortunately, there are no illustrations and the welcome message
7 readability, depending on the state, is around 11. This system does not provide links to more
8 information or testing sites.
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20 **DISCUSSION**

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22 Overall, most contact tracing apps included basic functionalities such as alerting users of exposures with
23 few clicks. The most room for improvement was in inclusivity for potential users. First, while the average
24 reading level in the U.S. is 7th-8th grade and 20% of adults cannot read above a 5th grade level,[23] the
25 readability of contact tracing apps (even excluding the comprehensive privacy policies) were higher and
26 potentially less accessible for the general population. High readability levels have also been reported for
27 privacy policies of other contact tracing apps.[23] Second, 30.6% of U.S. citizens over age 18 who speak a
28 language other than English speak English less than “very well,”[34] yet only 35% of apps were
29 accessible in languages other than English. Third, audiovisual features have the potential to enhance
30 understanding, improve recall, and make users feel familiar,[35, 36] and these were infrequent within
31 the contact tracing apps. Finally, none of the apps in this study provided direct links to social support
32 services that individuals may need in the event of an exposure alert.
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51 Prior studies evaluated contact tracing apps; however, this was mostly done outside the U.S. using
52 subjective rating scales, such as the Mobile App Rating Scale or the System Usability Score.[5, 9, 19-23,
53 28] Our more objective rating system with a specific emphasis on health communication and inclusivity
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1 may therefore offer new insights, such as providing novel data on audiovisual features, readability, and
2 inclusivity of graphics presented (e.g., people of different races, genders, and abilities).
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7 Our study has limitations. First, we acknowledge that these apps were designed within tight timeframes
8 and developers might not have been able to implement all features to date. We also did not use broader
9 usability metrics as identified in other research,[24-28] since our intention was to focus on health
10 communication and diverse end users more explicitly. Future work is needed to replicate and/or expand
11 our list of inclusivity and functionality criteria, as this paper is not intended to validate but rather to
12 enumerate and document the various domains to consider in this space. In addition, we did not fully
13 interact with the exposure alert systems because we did not come in contact with cases during the study
14 (i.e. we were unable to evaluate further links or information that may become available to users in the
15 event of an exposure alert). We also only evaluated the apps in English. Finally, it is possible that the
16 apps have changed since our evaluation due to the iterative nature of development. Despite these
17 limitations, our suggestions are still valid for future app development.
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37 **CONCLUSION**

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39 For contact tracing apps to be maximally effective, they must be usable and accessible to the population
40 they aim to serve, including those with low digital literacy and different backgrounds. Our findings
41 present concrete features and categories for developers to consider in current and future apps (for
42 contact tracing and beyond). Further, our work builds upon existing standards for accessibility of digital
43 health to reach diverse end users, such as those developed by the Agency for Healthcare Research and
44 Quality,[18] The Commonwealth Fund,[19], the FDA,[26] Xcertia,[31] and the National Academy of
45 Medicine.[32] Moving forward, developers should routinely reference these standards to increase
46 usability of apps and implementation guidelines into real-world practice.
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AUTHOR CONTRIBUTIONS

1
2
3 S.B. helped design the study and develop the usability framework, and then searched for apps, led
4
5 coding, and wrote the manuscript. S.L. double-coded apps and helped develop the framework, edited
6
7 the manuscript, and coordinated group members. M.N. helped design the search strategy and edit the
8
9 manuscript. U.S. and C.L. conceived of the study, helped develop the framework, reviewed coding, and
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11 edited the manuscript.
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COMPETING INTERESTS

17
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19 The authors have declared that no competing interests exist.
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32
33 is solely the responsibility of the authors and do not necessarily represent the official views of the study
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35 funders.
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DATA AVAILABILITY STATEMENT

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44 Data available from the authors upon request.
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Figure 1. Process of selecting apps for evaluation

Figure 2. Affiliation of app developer

Figure 3. Clickability of apps for various contact tracing-related functions

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11 Main search terms: "covid-19," "coronavirus," "exposure
12 notification," "contact tracing," "covid app"
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