

### PureConnect: A Localized Social Media System to Increase Awareness and Connectedness in Environmental Justice Communities

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#### **ABSTRACT**

Frequent disruptions like highway constructions are common nowa-days, often impacting environmental justice communities (communities with low socio-economic status with disproportionately high and adverse human health and environmental effects) that live nearby. Based on our interactions via focus groups with the members of four environmental justice communities impacted by a major highway construction, a common concern is a sense of uncertainty about project activities and loss of social connectedness, leading to increased stress, depression, anxiety and diminished wellbeing. This paper addresses this concern by developing a localized social media system called PureConnect with a goal to raise the level of awareness about the project and increase social connectedness among the community members. PureConnect has been designed using active engagement with four environmental justice communities affected by a major highway construction. It has been deployed in the real world among the members of the four environmental justice communities, and a detailed analysis of the data collected from this deployment as well as surveys show that PureConnect is potentially useful in improving community members' wellbeing and the members appreciate the functionalities it provides.

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MISNC 2024, August 21–23, 2024, Bali, Indonesia

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https://doi.org/10.1145/3675669.3675702

#### **CCS CONCEPTS**

- $\bullet$  Human-centered computing  $\to$  Empirical studies in collaborative and social computing;  $\bullet$  Social and professional topics
- $\rightarrow$  Cultural characteristics; Applied computing  $\rightarrow$  Sociology.

#### **KEYWORDS**

Local social media, Civic Engagement, Well-being, Planned Disruptions, Environmental Justice Communities, Intervention, Mobile app, Smartphone

#### **ACM Reference Format:**

Omar Hammad, Md Rezwanur Rahman, Gopala Krishna Vasanth Kanugo, Nicholas Clements, Shivakant Mishra, Shelly Miller, and Esther Sullivan. 2024. PureConnect: A Localized Social Media System to Increase Awareness and Connectedness in Environmental Justice Communities. In 2024 The 11th Multidisciplinary International Social Networks Conference (MISNC 2024), August 21–23, 2024, Bali, Indonesia. ACM, New York, NY, USA, 7 pages. https://doi.org/10.1145/3675669.3675702

#### 1 INTRODUCTION

A major construction in North Denver, Colorado, USA took place from 2019 to 2022 to reconstruct a 10-mile stretch of the interstate highway (C70 project). The benefits, as stated on the project website are to increase safety, improve infrastructure, increase economic vitality, and many more [8]. However, this construction also caused increased noise and air pollution in the vicinity as well as increased stress in the communities living in the vicinity. The overall goal of our Social Justice and Environmental Quality - Denver (SJEQ) project (https://www.sjeqdenver.com/) is to partner with the members of the communities living the vicinity of C70 project (Globeville, Elyria-Swansea, Cole, and Clayton neighborhoods) to understand

and address the disruptions caused and related neighborhood redevelopment. These four communities are Environmental Justice Communities (EJC)—low socio-economic status with disproportionately high and adverse human health and environmental effects [5]. The goal of SJEQ project is to first understand the negative impact of C70 on the health and well-being of these communities and then develop interventions to mitigate the negative impacts. Our project equipped and trained community members to use personal environmental sensors to monitor air pollution, and designed a set of apps where they can report their daily experiences related to construction and pollution.

To learn firsthand the community's local knowledge and concerns regarding the C70 project, we organized three focus groups in the Summer of 2021 with the residents of the four communities to discuss the topics of C70 construction and community concerns. Overall, 32 residents from these communities participated in our focus groups which included both English and Spanish speakers. We obtained approval from IRB before conducting these focus groups. In addition, we have developed a smartphone app called PurEmotion to understand the impact of the C70 construction project on people's well-being (See https://www.sjeqdenver.com/ and Section 3 for more information on PurEmotion).

A major issue that we identified from the three focus groups (32 participants) and two deployments of PurEmotion (80-85 participants per deployment) was getting unclear and often misleading information about the construction. Of the residents who had the information, they had heard about the project updates through flyers left on their fences by the city and word-of-mouth from friends and family. Furthermore, due to frequent road closures and air/noise pollution, there was a feeling of loss of social connectedness in the community. Participants mentioned that they would like to have better distribution of information about road closures and alerts. They also requested resources and activities to help them manage their stress caused by a sense of loss of social connectedness.

In this paper, we describe the design, implementation and evaluation of a localized social media service called PureConnect. The goal of PureConnect is to increase awareness about the construction activities and improve social connectedness among the community members. PureConnect has been implemented as a slack workspace (https://www.slack.com) with several channels that community members may use to converse with other community members. We aim to answer the following research questions:

- (1) What can we learn about environmental justice communities' behavior while using a localized social media service?
- (2) To what extent do the proposed intervention mechanism help in enhancing the well-being of environmental justice communities who live in the affected areas?

PureConnect has been implemented as a Slack workspace that allows community members to connect with one another under our team's supervision. In addition, relevant information about the construction project is posted by relevant authorities on this workspace. We deployed PureConnect in the four environmental justice communities over two different time periods (called cohorts), each lasting six to eight weeks. These deployments of PureConnect was done in conjunction with the deployment of the PurEmotion

app. Overall, sixty-nine community members used PureConnect along with the PurEmotion app in these two cohorts.

Feedback from the participants was overall positive, especially in the second cohort. In the first cohort, we have dedicated multiple channels for participants to communicate. However this caused confusion among the participants in deciding which channel is the right channel for the message they plan to post. Therefore, in the second cohort, we reduced the number of channels, resulting in better outcome. PureConnect includes use of different Slack Apps (Apps that run within Slack such as an auto-translator) to assist in managing the workspace, integration of third party APIs to provide relevant value to our users and multiple engagement tactics to see what would trigger community member's engagement. Feedback from the participants after using PureConnect was quite positive and evaluation from the data collected from the deployment (Pure-Connect and PurEmotion) shows that there was an improvement in the well-being of people when they used PureConnect. In particular, this paper makes the following important contributions:

- (1) PureConnect has been built and experimented with using active engagement with the environmental justice communities affected by a major construction.
- (2) Multiple investigations in terms of real-world deployment and surveys show that environmental justice community users appreciate PureConnect functionalities and this service is potentially useful in improving their well-being.

#### 2 LITERATURE REVIEW

Social ties and connection among community members are so important in times of hardship, for instance, to stand in the face of communities threats like crime and disasters [31], or against large construction projects that would affect the nearby areas [15]. An important characteristic of a strong community is its social capital, which is the combined value of social structure and engagement of community members [3, 9, 20]. High social capital can benefit communities during these hard times [22] and it has been proven to enhance community members' attachment [30], mental health [13, 28], empowerment [14] and trust [28]. This is especially important in the US where civic engagement is becoming weaker [25], and in places close to industrial and transportation areas that are subject to large construction projects that cause gentrification of low socio-economic people.

Gentrification consists of combined steps of decisions and actions by higher-income people in areas where lower-income people live that would cause them to be displaced by force from their residence [1, 4, 19, 32]. Another type of gentrification could be voluntarily done by some members of the community due to some changes in the structural and cultural aspects of their community [11] due to the consequences caused by large projects. A big factor in such actions that none can overlook is race [11], especially in a country with a long history of racial issues [2, 18].

All of this, and the decrease in social relations has increased the interest of HCI researchers to study community connectedness and how can it stand in the face of such disruptions [11, 21, 22]. One of the major topics that have gained a lot of focus is social media and its role in either strengthening social capital [22] or being against it [11]. In general, social media has been found to enhance social

capital [26] through the different ways that its users engage, like sharing photos, posts, and comments [6].

When users of these systems are geographically close, these systems are called hyper-local [21], or community-focused social media [22]. These local systems have a history of development in different forms such as bulletin boards [10], forums [12, 27], email lists [7, 17], and later social networks for neighborhoods, like Nextdoor.com, online conversation communities, and marketplaces [21]. Previous research has shown that these hyper-local systems contribute to helping communities in enhancing their social capital and connectedness [23]. A very relevant example of the benefit of such systems in strengthening communities is when Toronto residents rallied and took action against a construction company that built their homes using internet-based tech [3].

A well-known current local social media system that connects people who live in the same neighborhood together is Nextdoor.com [22]. The system requires its users to use their real names as it is aligned with their goal "to create a safe, trusted environment where neighbors can connect with each other." The system assigns a "lead" role to people who join a neighborhood first. These leads are giving permission to verify other joiners, moderate posts and adjust neighborhood boundaries. In order to allow new people to join a community, Nextdoor verifies them using physical mail addresses, or using their credit card information. In a semi-structured interviews study by [22] on Nextdoor's users, they have found that many of the users already know each other before and they have chosen to join the system despite already using other social media apps [22] which show the need of such systems. Many reasons were described such as the level of granularity that it had for each community, its affordance for conversations that its user's interface had [22]. However, they have noticed that most people use nextdoor for business instead of social communication, some users's described the fixed split between neighbourhoods as limiting and not convenient in some cases, and that people were concerned about their privacy of data.

Despite the huge benefit of local social media systems on communities, there are some arguments that such systems can have negative impacts of neighborhoods, such as gentrification [11]. Corbet and Loukissas [11] studied how systems like Yelp, Nextdoor, and Zillow can mediate the process of gentrification. After analyzing the work of Sharon Zukin [33] on the reviews of restaurants in New York in two neighborhoods, an African American and a Polish neighborhood on Yelp, Corbet and Loukissas [11] noted that some reviews mentioned the surrounding neighborhood and praised the gentrification process that is going on when talking about the African American restaurants, unlike the polish neighborhood where reviews were against gentrification. And since gentrification is a cooperative, and collective process, such reviews support or stand in the face of gentrification. Another system that was analyzed and claimed to mediate the process of gentrification is Nextdoor [11]. The system segregates neighborhoods into "Polygons" [24] and allows each user to be part of one neighborhood. These boundaries can produce some social effects like spacial-economic fragmentation which re-inforces "existing class and racial boundaries in increasingly divided cities, drawing lines between 'us' and 'them' and amplifying the voices of neighbors who want to use the site to profile people they consider outsiders, even those who may have

lived the area for generations" [24]. Eventually, this results in gentrification [11]. In the mentioned systems' support for gentrification, it is important to notice that the negative effects are caused by outsiders to each community, not by people within. In fact, the majority of the interactions and communications that took place within the community members were positive to them.

On top of their relative low-technical background, and varying ages, being a member in Environmental Justice (EJ) communities and undergoing continuous disruptions from construction projects gives its members specific traits such as mis-trust and loneliness. Although many researchers have investigated the impacts of deploying local social media systems [3, 6, 11, 22, 23, 26], none of them examined deploying those systems among EJ communities in particular.

#### 3 STUDY DESIGN

#### 3.1 Pre and Post intervention

PureConnect is part of a larger project (SJEQ-Denver project) that was started in January 2022. The overall goal of SJEQ-Denver is to understand and mitigate the negative impacts of the C70 construction project on people's well-being. This project is structured over two phases, pre-intervention and post-intervention phases. The goal of the pre-intervention phase is to understand the impact of C70 construction on the health and wellbeing of the community members. This phase was comprised of deployment of the PurEmotion app over two different time periods of six-eight weeks called Cohort 1 and Cohort 2 (January to July 2022) to collect wellbeing, location and air quality information from participants. PurEmotion is a smartphone diary app that community members use once a day to answer a few survey questions about their current feelings, their perceptions about the air quality around them and recent experience about their daily commutes.

Based on our findings from Cohort 1 and 2, we introduced three interventions: (1) PureConnect service to increase awareness about the construction project and improve social connectednesss, (2) indoor air cleaners to improve the indoor air quality, and (3) PureNav service to help community members navigate easier [16]. All these interventions were deployed together over two different time periods (Cohort 3 and Cohort 4) of six-eight weeks each. PurEmotion was deployed in these cohorts as well to assess the effectiveness of these interventions. Details of PureNav design, implementation and evaluation are described in [16], while information about the air cleaners is available at <a href="https://www.sjeqdenver.com/">https://www.sjeqdenver.com/</a>. This paper focuses on PureConnect.

#### 3.2 PureConnect

3.2.1 System Design. To address the problems of a sense of uncertainty about the project activities and loss of social connectedness caused by the construction activities, we have designed and evaluated a loaclized social media service called PureConnect (See Figure 1). Our initial set of requirements for this service are to include the following functionalities:

- A Q/A interface to answer community members' common questions about the construction project.
- A way for the community members to be able to express their concerns about the issues that they encounter.

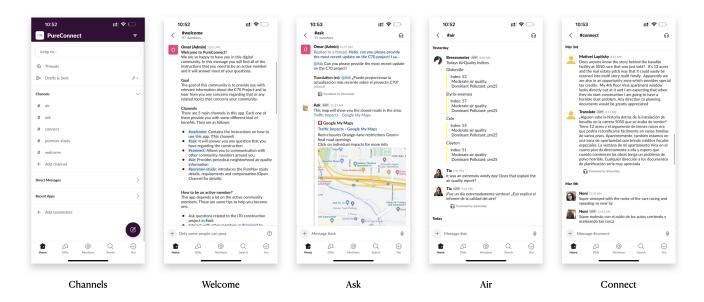


Figure 1: The main screens of Pureconnect app

 A forum to allow community members to discuss relevant community issues related to the C70 project.

After analyzing the requirements of this service we decided to use a Slack workspace (www.slack.com) and build these individual Slack apps to provide the required functionalities.

After deciding on Slack we needed to design the workspace to be aligned with our requirements. In the first version which we deployed in Cohort 3, we created the following slack channels:

- #welcome: on-boarding and usage instructions.
- #ask: chat-bot to answer questions about the construction.
- #express: express concerns about the project.
- #suggest: suggest ideas to help mitigate issues.
- #connect: allow community members to communicate with each other however they want.
- #air: periodic neighborhood air quality information.
- #info: periodic information about the current activities and status of the construction project.
- #researchers: a private channel for researchers to discuss any issues.
- #ask\_research: a private channel for admins to discuss any issues.

Since a large number of community members are Spanish speakers, we integrated a Slack app called Translate (https://apps.mt-hacks.com/translate/). Translate is a third-party application that allows language detection and translation. The app is installed on the PureConnect workspace and configurable by interacting with the application under the app's section. The current configuration enables detection and translation for the primary languages that are English and Spanish.

3.2.2 Dialogflow Chatbot Integration. The #ask channel was integrated with Google's Dialogflow. Dialogflow is "a natural language understanding platform from Google that helps developers

to design conversational interfaces and integrate them into their applications." [29]. We compiled a set of commonly asked questions about the C70 construction project from C70 website [8] as well as the questions we heard from the community members in the three focus groups and the two phases of deployment of PurEmotion app (Pre-intervention study in Cohorts 1 and 2). Dialogflow allows a chatbot developer to define a set of *intents* which is "the verb or action that is part of the conversation with the user" [29]. For instance "what is your name?", "what's your name?" have the same intent. We defined the following intents:

- How can I report road closures?
- How can we communicate our concerns?
- How is it impacting the air quality?
- How will environmental concerns be addressed?
- How will the construction project help the community?
- How would the research project help?
- I want to know more about the construction project.
- What can I do to be safe from air pollution?
- What is the status of the construction?
- What roads will be closed due to the construction project?
- Which neighborhoods are affected by this?
- Who is involved in the construction?

3.2.3 COTrip API Integration. The #info channel was linked to a cloud function that calls an API from the Colorado Department of Transportation (https://www.codot.gov/) that provides information about planned construction events. The API is part of a set of APIs provided by (cotrip.org) which provides periodic updates about road activities that happen in the State of Colorado. To run the function on a schedule, we developed an AWS Lambda function that runs each day at 9:00 AM and calls the *Planned Events* API. The API does not support the filtering of data so we filtered the data after receiving all the data points from the API (max 1000) data

points. The filtering function takes into account the latitude and longitude of each reported event and filters out any points that are farther than 10 km from the middle point of the four communities of interest. The function only reports the events that occur on the day of reporting.

#### 4 EVALUATION

PureConnect Version 1 was deployed among 14 users in Cohort 3 (October - December 2022) and Version 2 (with reduced number of channels) was deployed among 55 users in Cohort 4 (March - April 2023). To evaluate the efficacy of PureConnect, we analyze three aspects of data collected from the two deployments, level of user interactions via PureConnect, sentiments of the messages posted by users in PureConnect, and emotions of the PureConnect users.

#### 4.1 Users Interactions

There are two types of user interactions in PureConnect: Messages posted by the users and Reactions provided by the users on posted comments. A reaction on Slack is when a user taps on a message and adds an emoji reaction. Overall, the number of interactions in Cohort 3 were about one fifth the number of interactions in the Cohort 4. This is partly because of the lower number of users in Cohort 3. However, the average number interactions per user increased from 9.5 (Cohort 3) to 11.25 (Cohort 4). We attribute this increase in higher user interactions as well as our ability to recruit more user in Cohort 4 to increased awareness of PureConnect over time, which indicates that the users find PuerConnect useful. Not all of the participants were active throughout study, however, almost 10% of them were highly active interacting more than 30 times over the two months of deployment period, which is a common usage pattern in interactive social media services.

We also note that user interaction was mainly done using reactions in Cohort 3 (6.71 reactions/user vs 2.78 messages/user), while in Cohort 4, user interaction was mainly done by posting messages (4.74 reaction/user vs 6.5 message/user). Recognizing that posting a message takes much more effort than reacting, this shows that users found the second version of PureConnect (reduced number of channels) much more useful and engaging.

Table 1: The top reactions used

Reaction	count
4	241
	19
•	15
<b>:</b>	15
$\odot$	10
	9
	9
	8
	6
<b>&amp;</b>	5

Table 2: Average number of interactions per message for each channel

channels	Avg Interaction / user Cohort 3 Cohort 4	
air	1.71	4.5
connect	2.8	4.5
ask	3.33	3.03
express	1.19	N/A
info	0.48	N/A
suggest	0.62	N/A

Table 1 provides the details of the type of reaction users responded with. We see that the top emoji used is (Thumbs-up). Further, we notice that most of the reactions were positive reactions and very few reactions were negative. This indicates that users generally felt positive while using the PureConnect service. Finally, Table 2 shows the average number of interactions per user in each channel in the two cohorts. Note that the PureConnect version used in Cohort 4 had fewer channels compared to the number of channels in the first version used in Cohort 3. We can see that in Cohort 3, #ask channel had the most average number of interactions per user. However, in Cohort 4, when we reduced the number of channels, the average number of interactions per user in the #air and #connect channels increased significantly, while the average number interactions per user in the #ask channel remained about the same. Combining this with our earlier observation that the average number of interactions per user increased from Cohort 3 to Cohort 4, we can say that reducing the number of channels had a positive effect, possibly because people were less confused by which channel to post in.

#### 4.2 PureConnect and Feelings Correlation

As mentioned earlierin Section 3.1, PureConnect users used PurEmotion app as well in which they answered a few survey questions at least once every day about their current feelings, their perceptions about the air quality around them and recent experience about their daily commute. One of the question in PurEmption app prompts users to give a score on the following feelings from 1 to 5: Happy, Distressed, Irritable, Alert/Awake, Lonely. We analyzed correlation between the frequency of usage of PureConnect by users (number of user interactions-messages or reactions) with their feelings. Conducting Kendall's correlation analysis gave medium correlation values as seen in Table 3. We see that PureConnect usage is positively correlated with positive feelings and negatively correlated with negative feelings. To dig deeper we combined the low, medium and high levels of each feelings (low: 1 or 2; medium: 3; high: 4 or 5) and calculated the average number of interactions. We found that the average number of interactions was higher for users who have higher positive feelings (Happy). Similarly, and the average number of interactions was lower for users who have higher negative feelings (Distressed, Irritable, Lonely). For Alert/Awake, the pattern was not that clear. Conducting the ANOVA test for all feelings among the three level averages gave p value < 0.0001, which shows that there is a significant difference among them. Overall, this analysis shows that the usage of PureConnect helps

the emotional state of the users positively. Note that this is based on correlation and causation.

Table 3: Kendall Correlation values for different feelings with Number of submitted interactions in PureConnect

Feeling	Correlation with #Interactions
Нарру	0.199
Distressed	-0.233
Irritable	-0.223
Alert/Awake	0.140
Lonely	-0.200

### 5 INTERVENTION QUESTIONNAIRE SURVEY

To further evaluate the usefulness of PureConnect, we conducted a survey among all PureConnect users at the end of each of the cohorts (Cohort 3 and Cohort 4). This survey included the following general questions:

- (1) How helpful do you find PureConnect? (1 Not helpful at all, 10 Extremely helpful)
- (2) How easy do you find it to use PureConnect? (1 Not easy at all, 10 Extremely easy)
- (3) What did you like about PureConnect? (open ended)
- (4) What did you dislike about PureConnect? (Open ended)
- (5) Will you continue using the app after the study period? (Yes, No.)
- (6) How likely are you to recommend PureConnect to others? (1 Not at all - 10 Extremely)
- (7) Do you have any suggestions or comments for future releases of PureConnect?

In total we received 40 responses from the two cohorts, which is about 58% of the total PureConnect users. We provided a compensation of \$5 to the users for completing the surveys. Overall, users reported mixed feedback on helpfulness in Cohort 3. Users liked being connected to others and receiving air quality and odor information. However, they reported problems with usage and lack of in-depth interactions with others. In Cohort 4, helpfulness increased by 34% (from -0.1 to 0.2). This indicates that people appreciated having fewer chat channels, and more responsiveness to their messages. Average easiness slightly increase in Cohort 4 (0.53 to 0.63) after reducing the number of channels and providing more instructions regarding the purpose of PureConnect.

To learn how valuable PureConnect is compared to other social media apps, we asked the following questions:

- With regard to C70 Construction, what *other social media apps* have you used to connect with your community and discuss shared issues? (Nextdoor, Twitter, Facebook, Instagram, Reddit, Other)
- Compared to other social media apps that you have used, how valuable is PureConnect in increasing your awareness about C70? (1 Not valuable at all - 10 Extremely valuable)

- Compared to other social media apps that you have used, how valuable is PureConnect is making you feel connected with other community members? (1 Not valuable at all - 10 Extremely valuable)
- Compared to other social media apps that you have used, how valuable is PureConnect in making you feel listened to regarding C70? (1 Not valuable at all - 10 Extremely valuable)

Survey responses show that compared to other social media apps, users found PureConnect valuable in increasing their awareness about construction project activities (Avg 0.6 on a -1 to 1 scale), making them feel connected (Avg 0.4) and making them feel listened to (Avg 0.2). Overall, we can conclude from these results that PureConnect does help with increasing awareness about the construction activities and improving social connectedness among the community members, which was the goal of PureConnect.

#### 6 DISCUSSION

The goal of developing PureConnect was to contribute in mitigating the negative impacts of the C70 construction project on people's well-being. We began this study with three research questions.

# 6.1 Local social media usage behaviour for environmental justice communities

Our second research question was: What can we learn about environmental justice communities behavior while using a localized social media app? From what we observed, there are several things to learn from this study with regards to the usage behaviour of local social media systems.

First, it is important to keep the social media app simple with few functionalities and provide only the information users care about, otherwise app usage decreases. For instance in Cohort 3, we had a large number of channels and users could not decide which channel to post on. So we observed that people were mostly reactive in Cohort 3 where the number of reactions were significantly higher than posting messages. However, in Cohort 4 where we reduced the number of channels to three, we observed that users posted significantly more messages on average.

Another clear observation that we had is the overall positive way users discuss issues in these settings. Although there were complaints about several issues like smell and traffic, users generally tried to present their thoughts positively.

# 6.2 The effect of the intervention on users' well-being

Our last research questions was: To what extent do the proposed intervention mechanism help in enhancing the well-being for environmental justice communities who live in the affected areas?

In order to answer this question we analyzed the data from Pure-Connect usage as well as two surveys that administered at the end of each cohort. Based on this analysis, we identify four results that show that PureConnect did help in enhancing the well-being for environmental justice communities who live in the affected areas. First, we analysed the average feelings of the users in two cohorts. We found that compared to pre-intervention phase (Cohort 1 and

Cohort 2) that was conducted prior to the PureConnect usage (See <a href="https://www.sjeqdenver.com/">https://www.sjeqdenver.com/</a>), the average level of positive feelings was higher in Cohort 3 and Cohort 4, and the average level of negative feelings was lower in Cohort 3 and Cohort 4. This difference was significantly pronounced for the feelings of happiness and loneliness. This indicates that the interventions we introduced did help in improving users' well-being. However, we do note that we introduced three interventions as mentioned in Section 3.1, and so the improvement in user feelings is due to the combined impact of three interventions and not just PureConnect alone.

Second, to dig deeper and see if PureConnect had some effects on feelings or not, we further investigated the level of usage of PureConnect with users' levels of feelings. We found that there was a positive correlation between the total number of interactions and positive feelings and negative correlation between the total number of interactions and negative feelings. We found this to be significant for all feelings. This clearly shows that PureConnect usage positively contributed to improving users' well-being.

Next, when we conducted sentiment analysis on message shared in PureConnect, and found that positive sentiments were significangtly higher than negative sentiments, even when users discussed problematic issues in the community. Their language was positive, such as when one use shared that they are so excited to make changes in the community, or when they discussed their concerns with each other, they felt like they are not alone in this and have support. Finally, our analysis of survey responses clearly show that users found PureConnect very useful.

It is important to note that all our analysis is based on correlation and does not establish a causal link between PureConnect usage and people's wellbeing. Further detailed investigation is needed to establish causality.

#### **REFERENCES**

- [1] Rowland Atkinson. 2002. Does gentrification help or harm urban neighbourhoods?: An assessment of the evidence-base in the context of new urban agenda. Vol. 5. ESRC Centre for Neighbourhood Research Bristol.
- [2] Courtney M Bonam, Hilary B Bergsieker, and Jennifer L Eberhardt. 2016. Polluting Black space. Journal of Experimental Psychology: General 145, 11 (2016), 1561. Publisher: American Psychological Association.
- [3] Pierre Bourdieu. 2008. 15 the Forms of Capital. Readings in economic sociology 4, 280 (2008), 280–291. Publisher: John Wiley & Sons.
- [4] Japonica Brown-Saracino. 2013. The Gentrification Debates: A Reader. Routledge. Google-Books-ID: EZDcAAAAQBAJ.
- [5] Robert D. Bullard and Beverly H. Wright. 1993. Environmental Justice for all: Community Perspectives on Health and Research. *Toxicology and Industrial Health* 9, 5 (Sept. 1993), 821–841. https://doi.org/10.1177/074823379300900508 Publisher: SAGE Publications Ltd STM.
- [6] Moira Burke, Robert Kraut, and Cameron Marlow. 2011. Social capital on facebook: differentiaiting uses and users CHI. MAY.
- [7] JM Carroll and MB Rosson. 1996. Developing the Blacksburg village. Commun. ACM 39, 12 (1996), 74–89.
- [8] CDOT. 2019. Central 70 Project. https://www.codot.gov/projects/i70east
- [9] James S. Coleman. 1988. Social Capital in the Creation of Human Capital. Amer. J. Sociology 94 (Jan. 1988), S95-S120. https://doi.org/10.1086/228943 Publisher: The University of Chicago Press.
- [10] Ken Colstad and Efrem Lipkin. 1976. Community memory: a public information network. ACM SIGCAS Computers and Society 6, 4 (Dec. 1976), 6–7. https://doi.org/10.1145/958785.958788
- [11] Eric Corbett and Yanni Loukissas. 2019. Engaging Gentrification as a Social Justice Issue in HCI. In Proceedings of the 2019 CHI Conference on Human Factors in Computing Systems (CHI '19). Association for Computing Machinery, New York, NY, USA, 1–16. https://doi.org/10.1145/3290605.3300510
- [12] Lincoln Dahlberg. 2001. Extending the public sphere through cyberspace: The case of Minnesota E-Democracy. First Monday (March 2001). https://doi.org/10. 5210/fm.v6i3.838

- [13] M Elliott. 2000. The stress process in neighborhood context. Health & Place 6, 4 (Dec. 2000), 287–299. https://doi.org/10.1016/S1353-8292(00)00010-1
- [14] Karlyn J. Geis and Catherine E. Ross. 1998. A New Look at Urban Alienation: The Effect of Neighborhood Disorder on Perceived Powerlessness. Social Psychology Quarterly 61, 3 (1998), 232–246. https://doi.org/10.2307/2787110 Publisher: [Sage Publications, Inc., American Sociological Association].
- [15] Mark S. Granovetter. 1973. The Strength of Weak Ties. Amer. J. Sociology 78, 6 (May 1973), 1360–1380. https://doi.org/10.1086/225469 Publisher: The University of Chicago Press.
- [16] Omar Hammad, Md Rezwanur Rahman, Nicholas Clements, Shivakant Mishra, Shelly Miller, and Esther Sullivan. 2023. PureNav: A Personalized Navigation Service for Environmental Justice Communities Impacted by Planned Disruptions. In The 2023 IEEE/ACM International Conference on Advances in Social Networks Analysis and Mining (ASONAM 2023). Kusadasi, Turkey.
- [17] Keith Hampton and Barry Wellman. 2003. Neighboring in Netville: How the Internet supports community and social capital in a wired suburb. City & Community 2, 4 (2003), 277–311. ISBN: 1535-6841 Publisher: Wiley Online Library.
- [18] Larry Keating. 2001. Atlanta: Race, Class And Urban Expansion. Temple University Press. Google-Books-ID: Al2un7Z177YC.
- [19] L Lees, T Slater, and E Wyly. 2010. The gentrification reader Routledge. (2010). Publisher: London.
- [20] N Lin. 1999. Building a network theory of social capital connections, 22, 28–51. Google Scholar (1999).
- [21] Claudia López, Rosta Farzan, and Yu-Ru Lin. 2017. Behind the Myths of Citizen Participation: Identifying Sustainability Factors of Hyper-Local Information Systems. ACM Transactions on Internet Technology 18, 1 (Nov. 2017), 11:1–11:28. https://doi.org/10.1145/3093892
- [22] Christina A. Masden, Catherine Grevet, Rebecca E. Grinter, Eric Gilbert, and W. Keith Edwards. 2014. Tensions in scaling-up community social media: a multi-neighborhood study of nextdoor. In Proceedings of the SIGCHI Conference on Human Factors in Computing Systems (CHI '14). Association for Computing Machinery, New York, NY, USA, 3239–3248. https://doi.org/10.1145/2556288. 2557319
- [23] Dara O'Neil. 2002. Assessing community informatics: a review of methodological approaches for evaluating community networks and community technology centers. *Internet Research* 12, 1 (Jan. 2002), 76–102. https://doi.org/10.1108/ 10662240210415844 Publisher: MCB UP Ltd.
- [24] Will Payne. 2017. Welcome to the Polygon: Contested Digital Neighborhoods and Spatialized Segregation on Nextdoor. Computational Culture 6 (Nov. 2017). http://computationalculture.net/welcome-to-the-polygon-contested-digital-neighborhoods-and-spatialized-segregation-on-nextdoor/
- [25] Robert D. Putnam. 2000. Bowling Alone: The Collapse and Revival of American Community. Simon and Schuster. Google-Books-ID: rd2ibodep7UC.
- [26] Harrison Rainie and Barry Wellman. 2012. Networked: The new social operating system. Vol. 10. Mit Press Cambridge, MA.
- [27] Everett M. Rogers, Lori Collins-Jarvis, and Joseph Schmitz. 1994. The PEN project in Santa Monica: Interactive communication, equality, and political action. Journal of the American Society for Information Science 45, 6 (1994), 401–410. https://doi.org/10.1002/(SICI)1097-4571(199407)45:6<401::AID-ASI6>3.0.CO;2-N \_eprint: https://onlinelibrary.wiley.com/doi/pdf/10.1002/%28SICI%291097-4571%28199407%2945%3A6%3C401%3A%3AAID-ASI6%3E3.0.CO%3B2-N.
- [28] Catherine E. Ross and Sung Joon Jang. 2000. Neighborhood Disorder, Fear, and Mistrust: The Buffering Role of Social Ties with Neighbors. American Journal of Community Psychology 28, 4 (2000), 401–420. https://doi.org/10.1023/A.1005137713332 \_eprint: https://onlinelibrary.wiley.com/doi/pdf/10.1023/A%3A1005137713332.
- [29] Navin Sabharwal and Amit Agrawal. 2020. Introduction to Google Dialogflow. In Cognitive Virtual Assistants Using Google Dialogflow: Develop Complex Cognitive Bots Using the Google Dialogflow Platform, Navin Sabharwal and Amit Agrawal (Eds.). Apress, Berkeley, CA, 13–54. https://doi.org/10.1007/978-1-4842-5741-8\_2
- [30] Robert J. Sampson. 1988. Local Friendship Ties and Community Attachment in Mass Society: A Multilevel Systemic Model. American Sociological Review 53, 5 (1988), 766–779. https://doi.org/10.2307/2095822 Publisher: [American Sociological Association, Sage Publications, Inc.].
- [31] Robert J. Sampson. 2012. Great American City: Chicago and the Enduring Neighborhood Effect. University of Chicago Press. Google-Books-ID: POs5iroB7PsC.
- [32] Tom Slater. 2006. The Eviction of Critical Perspectives from Gentrification Research. International Journal of Urban and Regional Research 30, 4 (2006), 737–757. https://doi.org/10.1111/j.1468-2427.2006.00689.x \_eprint: https://onlinelibrary.wiley.com/doi/pdf/10.1111/j.1468-2427.2006.00689.x.
- [33] Sharon Zukin, Scarlett Lindeman, and Laurie Hurson. 2017. The omnivore's neighborhood? Online restaurant reviews, race, and gentrification. *Journal of Consumer Culture* 17, 3 (Nov. 2017), 459–479. https://doi.org/10.1177/1469540515611203 Publisher: SAGE Publications.