# Improving accessibility to radiotherapy services in Cali, Colombia: cross-sectional equity analyses using open data and big data travel times from 2020.

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# Abstract

In this study, we employed a methodology to evaluate and forecast the cumulative opportunities for residents to access radiotherapy services in Cali, Colombia, while accounting for traffic congestion from an equity perspective. Furthermore, we identified 1-2 optimal locations where new services would maximise accessibility. We utilised open data and publicly available big data.

#### Methodology:

Using a people-centred approach, we tested a web-based digital platform developed through design thinking. The platform integrates open data, including the location of radiotherapy services, the disaggregated sociodemographic microdata for the population and places of residence, and big data for travel times from Google Distance Matrix API. We used genetic algorithms to search heuristics to identify optimal locations for new services. We predicted accessibility cumulative opportunities (ACO) for traffic ranging from peak congestion to free-flow conditions at hourly assessments for 6–12 July 2020 and 23–29 November 2020. The interactive digital platform is openly available.

#### Primary and Secondary Outcomes:

We present descriptive statistics and population distribution heatmaps based on 20-minute Accessible Catchment Area (ACO) isochrones for car journeys. These isochrones connect the population-weighed centroid of the traffic analysis zone at the place of residence to the corresponding zone of the radiotherapy service with the shortest travel time under varying traffic conditions, ranging from free-flow to peak-traffic congestion levels. Additionally, we conducted a time-series bivariate analysis to assess geographical accessibility based on economic stratum. We identify 1–2 optimal locations where new services would maximise the 20-minute ACO during peak-traffic congestion.

#### **Results:**

Traffic congestion significantly diminished accessibility to radiotherapy services, particularly affecting vulnerable populations. For instance, urban 20-minute ACO by car dropped from 91% during free-flow traffic to 31% during peak traffic for the week of 6–12 July 2020. Specific ethnic groups, individuals with lower educational attainment, and residents in the outskirts of Cali experienced disproportionate effects, with accessibility decreasing to 11% during peak traffic compared to 81% during free-flow traffic for low-income households. We predict that strategically adding sufficient services in 1–2 locations in eastern Cali would notably enhance accessibility and reduce inequities. The recommended locations for new services remained consistent in both of our measurements.

These findings underscore the significance of prioritising equity and comprehensive care in healthcare accessibility. They also offer a practical approach to optimising service locations to mitigate disparities. Expanding this approach to encompass other transportation modes, services, and cities, or updating measurements, is feasible and affordable. The new approach and data are particularly relevant for planning authorities and urban development actors.

## Study in context

#### What we know on this topic:

The benefits of setting up new hospitals and health services in areas that are accessible and convenient to patients are well known, particularly to vulnerable populations. Moreover, people increasingly prefer to visit healthcare sites where they spend their daily lives rather than travel great distances or sit in traffic. Direct and indirect costs associated with long journeys impact adherence, clinical outcomes, and patients' and their families' quality of life and economy. Having conveniently located health services contributes to spatial justice and health equity.

This report expands on our studies for haemodialysis and tertiary care emergency services. Those studies assessed the feasibility of generating dynamic geographical accessibility measurements by integrating open data and big data in participatory processes with stakeholders while incorporating an equity perspective. Our previous findings also identified eastern Cali as the priority area where new services would optimise accessibility. However, the recommended sectors varied as the distribution of haemodialysis and tertiary care emergency services differs from radiotherapy services.

#### What this study adds:

This study introduces an innovative tool for both public and private sectors to strategically plan the establishment of new healthcare sites, focusing on urban accessibility to critical services such as radiotherapy. Utilising relatable cartography and descriptive statistics, the tool effectively communicates assessments and predictions regarding urban accessibility to radiotherapy services in Cali. It identifies optimal locations for new radiotherapy services, considering factors such as traffic congestion, and offers crucial data-driven insights for enhanced health services planning. This study tests a practical approach involving relevant stakeholders in response to numerous calls from leaders and intersectoral organisations advocating for participatory intersectoral actions to integrate health equity with urban and health services planning.

#### How might this study affect research, practice, or policy?

This study supports a fundamental shift in approaching accessibility measurements for health services when traffic congestion is a factor. This approach equips advocates and stakeholders to participate in urban and health services planning with accurate and relatable data, fostering intersectoral and multistakeholder collaborations. The study also offers an interactive public platform for testing data and scenarios.

Governments, local authorities, and health/insurance companies stand to benefit from incorporating these measurements into their health and urban planning policies. This integration can lead to improvements in overall accessibility, efficiency, and public participation. Moreover, the study holds the potential to influence policies that prioritise public health by underscoring the critical role of addressing traffic congestion in ensuring equitable access to health services. It sheds light on the impact of travel times as barriers to adherence and access to health services, particularly in conjunction with appointment opportunities and authorisations.

# Introduction

Traffic congestion reduces accessibility to health services and might affect population groups differently. However, measuring congestion has been elusive for practical reasons.<sup>1</sup> Most measurements have focused on average travel times or distances, which is problematic since fixed average estimates are misleading when traffic fluctuates and varies across sectors.<sup>1–4</sup> In these situations, residents often plan their movements based on travel times rather than distance due to the rarity of smooth, free-flow traffic that usually allows for predictable and economical transportation. In this article, we will refer to geographical accessibility measurements that consider temporospatial variations in traffic congestion as dynamic geographical accessibility measurements (DGAMs).

For example, a 2017 study using fixed estimates to measure accessibility to tertiary care emergency services in Cali, Colombia, yielded results like free-flow traffic in the first hours of weekdays, which a 2020 DGAM also captured. However, Cali is among the most traffic-congested cities in South America.<sup>5</sup> The DGAM showed that under usual traffic congestion conditions, urban accessibility to tertiary care emergency services dropped from 84% to 38%, revealing a previously overlooked problem.<sup>6–10</sup> Reduced accessibility can adversely impact the overall quality of healthcare, life, and health outcomes.

However, studies on accessibility to service provision are often done with minimal stakeholder involvement, disregarding knowledge translation recommendations.<sup>11–18</sup> Furthermore, these studies employ complex methods and communicate findings to a specialised audience, which may not always be directly related to healthcare. Such assessments are usually cumbersome to update and rarely offer interactive options, rendering them ineffective for testing different scenarios, assumptions, monitoring, and planning.<sup>1,8,19–23</sup>

A research project in Cali's informal settlements of the western peripheral Commune 18 produced qualitative data highlighting the problems people face when accessing outpatient services they frequently use, such as cancer treatments or haemodialysis.<sup>24–26</sup> These patients and their families can face financial hardship from the direct and indirect high costs (e.g., lost wages and transportation) of lengthy travel to receive such services.<sup>27–34</sup>

Radiotherapy is an essential component of cancer care.<sup>35</sup> Comprehensive quality cancer treatments involving radiation therapy encompass additional interventions to improve physical, social, and mental well-being, providing support, education, and rehabilitation for patients and carers.<sup>36–38</sup>.<sup>39</sup> Radiotherapy is typically administered on an outpatient basis, requiring patients to visit the radiotherapy facility daily throughout the treatment course, which may span several weeks. This fact adds complexity to the analysis of accessibility to service provision.

Data and insights are needed to understand the factors contributing to poor spatial (geographical) accessibility to radiotherapy services and to address health equity. Measuring the effects of traffic

congestion on accessibility among populations enables data-driven approaches to address underlying issues, such as land-use policies or other factors contributing to market failure and service scarcity in underserved areas, including revenue, availability of specialists, or insecurity. Individual ability to pay is not directly linked to service payments in Colombia because health insurance schemes make most payments but need to systematically cover transportation.<sup>40</sup> A systematic review assessing the use of geographical information systems for radiotherapy planning found no studies providing an equity perspective that considered traffic congestion in low or middle-income countries, part of a multistakeholder coalition, or following a participatory people-centred approach.<sup>41</sup>

Transportation subsidies are increasingly available in Colombia to treat high-cost diseases like cancer. However, these subsidies can perpetuate inequities because they need to account for factors that define out-of-pocket and indirect costs, such as travel time or distance. Furthermore, implementing these subsidies in 2020 was not systematic, leaving disadvantaged populations facing accessibility challenges.<sup>27,42–45</sup> Poor geographical accessibility to cancer treatments diminishes the quality of care and is associated with poor clinical outcomes.<sup>38,41,46–50</sup>

In this study, we aim to assess the impact of traffic congestion on the accessibility of radiotherapy services within urban Cali; explore the connections between sociodemographic factors influencing health equity, traffic congestion patterns, and the accessibility of healthcare services; and predict the enhanced accessibility of radiotherapy services by strategically introducing facilities in 1–2 key locations. This predictive model is designed to optimise service accessibility and cater to the healthcare needs of Cali's diverse population.

## Methods:

This study outlines a ground-breaking, people-centred approach to generating DGAMs for health services. The investigators comprise a multistakeholder international team seeking to promote datadriven health services planning and health equity.<sup>51,52</sup> The project examined tertiary care emergency services, for which time is critical, and two outpatient services that require frequent and prolonged attendance: haemodialysis and radiotherapy; this report focuses on the latter.<sup>53</sup>

We developed the AMORE web-based platform to integrate open sources (adjusted census microdata matched to TAZs), add travel times and perform all measurements. We used design thinking throughout the platform's development. We held twenty-eight interviews and discussion groups with key informants, experts and stakeholders to get feedback and insights as the AMORE Platform was developed, leading to enhanced prototypes and presenting data in ways relatable to end-users.<sup>16,53</sup> We identified radiotherapy services in Cali using the Colombian National Health Services Registry. We obtained travel times big data from Google Distance Matrix API for the weeks of July 6–12 and 23–29 November 2020.<sup>53</sup>

The AMORE web-based platform displays accessibility cumulative opportunities (ACO), also known as isochronic indices, a metric for the number or proportion of opportunities of reaching a destination

(i.e., radiotherapy service) within a specified travel time (i.e., 20 minutes by car).<sup>54</sup> We used advanced heuristic genetic algorithms to predict the 1–2 locations where new services would maximise the accessibility across Cali. Those algorithms factored in disaggregated accessibility data by the sociodemographic population characteristics.

#### Study Population and Setting

Cali, a tropical city nested in a valley, lies between the western Andean mountains and the west bank of the Cauca River. Some of its neighbourhoods cover the western Andean slopes, including those along the road leading to the Pacific in northwest Cali. This location makes Cali the only major Colombian city with access to the Pacific coast. This study focused on the urban population of Cali, as estimated for 2020 after updating the recorded 2018 national census microdata, as described in the research protocol.

#### **Radiotherapy Services**

In 2020, Cali registered five radiotherapy facilities in the Colombian Special Registry of Health Services Providers (REPS in Spanish). Radiotherapy services are close to the north-south corridor on the lower part of the western Andean slopes and the western valley, where most residents in high-income housing live. However, some high-income residents live in villas and mansions in southern Cali, and high-income housing hosts 9% of the population, including low-income resident homeworkers. Four are in the western part of Cali and one in the south, all in well-off areas (Figure 3). These radiotherapy facilities have extended hours from Monday to Saturday, providing crucial healthcare services.

#### Study design

This cross-sectional study used the AMORE web-based platform to integrate big data of travel times with georeferenced microdata from the adjusted 2018 national census, TAZs, and the geographic locations of radiotherapy services.<sup>7,53,55,56</sup> The data sources integrated into the platform Included the 2018 National Census Data for Cali, obtained from the public official databases of the Colombian National Department of Statistics (DANE in Spanish)<sup>57,58</sup>; administrative divisions of Cali obtained from the Colombian IDESC Geoportal, Traffic Analysis Zones (TAZ), and census block sectors<sup>59,60</sup>; Google's Distance Matrix API; and information about the five radiation therapy services in Cali. The complete list of variables can be found in the study in the protocol.<sup>53</sup>

For this baseline assessment of urban Cali, on July 3, 2020, we downloaded predicted travel times for the week of 6–12 July 2021. For the week of 23–29 November 2020, we downloaded the expected times on 27 October 2020. None of these weeks had holidays, and they offered an opportunity to explore variations during the COVID-19 pandemic. Travel times varied substantially during the COVID-19 pandemic, and it is unclear how this influenced Google Distance Matrix algorithms.<sup>61</sup> Empirical and anecdotal reports suggest they remained accurate. Radiotherapy facility data was obtained using REPS service codes 711 (radiotherapy as complementary or diagnostic treatment) and 408 (outpatient radiotherapy). These centres were registered under both service

codes in 2020 and remained unchanged as of 30 November 2023.<sup>62</sup> We did not include providers offering only nuclear medicine (code 715).

## Statistical analysis

This analysis focuses on frequencies and bivariate analyses to represent cumulative opportunities as a measure of accessibility.<sup>54</sup> Critical variables for this report are travel time from residential TAZs to the TAZ hosting the radiotherapy service with the shortest journey time and the housing and sociodemographic characteristics of the population, as recorded in Colombian national census microdata. The AMORE web-based platform displays absolute and relative population per travel time threshold measured for each of the nine traffic congestion levels, ranging from free-flow to peak traffic congestion. We use isochrones or choropleths to represent the shortest median journey time required to reach a radiotherapy service at each hour of the day throughout the week.

# **Results / Outcomes**

### Participants

This study focused on the urban population of Cali registered in the 2018 census, adjusted to 2020 figures, with 2,258,823 residents living in 596,051 households in 582,814 housing units. Most of the population is mestizo or white (83.7 %, labelled in the census as "Others") or Afro-descendants (326,492; 14.5%). Islanders (from the Department of San Andrés and Providencia) and Rrom people represent less than 1% of the population. <sup>63</sup>

The resulting population is 2,258,823 urban residents living in 507 TAZs and comprising 596,051 households within 582,814 housing units. Figure 1 summarises the sociodemographic characteristics of the population.<sup>53</sup> Cali consisted of 22 communes in 2020, but began transitioning to becoming a Special District with six localities in 2023. <sup>64–67</sup> This change might raise the interest of local advocates in accessibility assessments among constituencies concerned about the availability and quality of health services in their communities.

The socioeconomic distribution of dwellings for Cali shows that 1,109,549 residents (49% of the population) live in low-income housing. Most low-income housing is in the eastern and northeastern Cali and the western Andean slopes, including the areas along the road to the Pacific coast. Most of the 935,699 middle-income Cali residents (about 41% of the population) live in 257,153 households in the central and southeast corridors of the city (Figure 2 and Figure 3).

Colombian national high-cost treatment monitoring services reported 527 new radiotherapy schemes (incident cases) in the five radiotherapy centres in Cali in 2020 (Cuenta de Alto Costo, Data request 5376, 29 May 2023). While most Cali residents, including those in vulnerable situations, live in densely populated outlying regions, radiotherapy services are in well-off areas with low population density.<sup>53</sup>

#### Effects of traffic on accessibility to radiotherapy services: Baseline results

Figure 1 shows the situational analysis interface for July 2020 with absolute population data. Tables 1 and 2 present the absolute and relative effects of peak traffic on the 20-minute ACO for the Cali population. Data are disaggregated by household income level, ethnicity, gender, age, education level, and civil status as measured in July 2020 and November 2020.

Figures 4 and 5 show the interface for July and November, respectively, with a travel-time threshold of 20 minutes and relative population figures. The 20-minute threshold was arbitrary and found reasonable in most focus groups. There is no set national or international standard for these travel time thresholds. Figure 6 complements these data, showing the variations between the July and November assessments, with the resulting improvements from reduced traffic congestion in November, when accessibility doubled.

#### Effect of traffic variations (6–12 July vs 23–29 November 2020)

We found that during periods of traffic congestion, most people living in low-income housing had lower geographic accessibility to radiotherapy services, both in November 2020 and July 2020. Our analysis showed that travel times represent an access barrier for low-income households, areas with high population density, and individuals residing in peripheral sectors of Cali (Figure 6).

Traffic congestion exacerbated inequities by disproportionately impacting the poorest populations on the outskirts of Cali (Table 1, Figure 6, and Figure 7). Traffic congestion significantly decreased in the November measurements following the reinstatement of COVID-19 pandemic measures, such as stay-at-home orders and license-plate-based driving restrictions. In contrast, such measures were absent in July, leading to lower accessibility, particularly for residents in low-income housing (11.2% in July compared to 42.8% in November) and middle-income housing (42.8% in July compared to 75% in November). The change was less dramatic for those in high-income housing, with accessibility rates of 82.6% in July compared to 89.5% in November (Table 1 and Figure 6), as many of the services are in high-income sectors of Cali.

In July, Afro-descendants and the smaller Palenque community experienced the lowest accessibility rates, with 15.2% and 11%, respectively. In contrast, Islander and 'other' populations (including whites and mestizos) fared significantly better, with accessibility rates of 40% and 33.4%, respectively. The small Palenque population, concentrated in a few neighbourhoods near the 20-minute ACO thresholds, benefited the most when traffic congestion eased in November, reaching an accessibility rate of 78.8%, followed by indigenous communities at 67.5% (Table 2).

Individuals with graduate and bachelor's degrees consistently experienced better accessibility and were less affected by reduced traffic congestion. Marital status also influenced accessibility, with married individuals or those in partnerships having lower accessibility in July (31.3%). However, as traffic congestion eased, accessibility rates became more uniform across different marital statuses, ranging from 60.5% for couples to 66.5% for widowers.

We observed an age-related gradient in accessibility, with older populations enjoying better access (Tables 1 and 2). Interestingly, all age groups benefited similarly from the traffic congestion relief (Table 1).

#### Effects of the addition of new radiotherapy providers

We analysed what peak-traffic accessibility would look like if new radiotherapy facilities were optimally located in 1-2 TAZs. Optimising urban accessibility during peak traffic hours consistently pointed to the need to add new services in the eastern sector of *La Base* with enough capacity to absorb the demand. This finding was consistent for both measurement periods. Simulating the addition of this new service in July increased predicted urban accessibility from 30.8% to 61.6%. This addition expanded the 20-minute ACO to include 695,502 more inhabitants (Table 2).

This improvement remained substantial in November, with accessibility rising from 60.4% to 91.5% and incorporating 702,618 more inhabitants into the 20-minute ACO, markedly raising accessibility rates for all income levels and nearly all marital statuses, education levels, and ethnic groups. These results indicate that adding radiotherapy services in eastern Cali, specifically in or near La Base, will likely address critical health equity concerns related to accessibility (Tables 1 and 2 and Figure 8).

Adding services in two new locations would significantly increase Cali's accessibility to radiotherapy services. While July and November predictions point to four different geographical areas, the recommended sectors are in the northeast and southeast and are adjacent (Figure 8). July predictions showed that adding radiotherapy services in La Alianza in the northeast and Rodrigo Lara Bonilla in the southeast would increase peak-traffic ACO opportunities by 168%, reaching 82.6% of the population (Figure 12), with 1,169,054 inhabitants incorporated into the 20-minute peak-traffic ACO (compared to the baseline). Similarly, November predictions revealed that locating services at Los Parques de Barranquilla in the northeast would accommodate around 450,000 inhabitants, and at Los Comuneros III in the southeast, it would serve about 842,000 into the 20-minute peak-traffic ACO.

The evidence, drawn from measurements in both July and November, clearly shows the positive impact introducing new radiotherapy services would have on accessibility, particularly in eastern Cali. Moreover, the data also shows it is better to add more sites. In July, the increase from adding two sites instead of one was 21.0%. In November, although lower by 7.9% (178,426), this increase still represents a substantial number of people.

#### Other analyses

Comparing July and November 2020

We predicted the impact on cumulative accessibility for July and November 2020 by adding services in 1–2 locations to optimise urban accessibility. We present the relative figures in Table 2 and Figure 9 and the absolute figures in Table 3. Both tables estimate the impact of adding services in one and two sectors. We found that new services have the potential to dramatically reduce inequities in

accessibility to health services, leaving radiotherapy services within a 20-minute journey by car for most inhabitants.

Figure 11 and Figure 12 illustrate the AMORE web-based platform interface with the graphs and data from the predictions for adding services in one and two sectors, respectively. The charts depict the notable reduction of inequities in relative figures (Table 1), complementing the absolute figures from Table 2.

## Discussion

Access to radiotherapy services in Cali presents significant challenges for most of the population, particularly residents in outlying areas. The city's layout and demography have changed, and land use and health services planning can be updated, benefitting from this approach and travel time data for data-driven integration of health and equity with the urban agenda. <sup>68,69</sup> Our new data indicates populations in the city's east and outlying areas are being left out. This should challenge traditional approaches and support action to correct social injustice and inequities.<sup>48</sup>

Our findings highlight the potential for dramatic improvements achievable by relevant decisionmakers by promptly adding 1–2 new radiotherapy services to eastern Cali, strategically located to optimise accessibility. Traditionally, radiotherapy services have been collocated with tertiary care emergency services, but none exist in Cali's east.<sup>7,38</sup> Recently, stand-alone centres have been developed elsewhere, prompting consideration of whether Cali should have a tertiary care hospital in the east offering comprehensive radiotherapy services or if stand-alone centres are more suitable.

If decision-makers add services in a single area, La Base or its surroundings emerge as the optimal location to maximise accessibility. These services must have the capacity to meet the high demand from the covered populations and remain accessible to all radiotherapy patients. Expanding capacity in the east could alleviate demand pressure on existing centres, freeing up resources to accommodate the needs of metropolitan areas and neighbouring communities.

We found traffic congestion disproportionately affects residents in outlying areas, low-income housing, Afro-descendants, and residents with lower educational attainment and younger age. This study brings attention to the consolidation of the "inverse care law" to radiotherapy services in Cali, mirroring patterns seen in tertiary care emergency services and haemodialysis.<sup>7,70</sup> The higher impact on vulnerable populations exacerbates social injustice and health inequity.<sup>71,72</sup> As previous studies have suggested, residents in informal settings, like others facing vulnerability and inequity in accessibility, are more likely to be disconnected from formal transportation modes. Exploring this further could provide valuable insights, especially if the study were replicated for other means of public transportation.

This study underscores the imperative of allowing patients to utilise reachable services with the shortest journeys. Since radiotherapy is an integral part of a comprehensive treatment, service

providers should avoid fragmenting healthcare services to maximise accessibility and quality of care.<sup>36,37,73</sup> Recognising that many individuals may face challenges accessing the service providers with the shortest journeys, our study findings are intended to encourage and inform societal agreements to improve accessibility to such radiotherapy services. This challenge will likely extend to other cities in Colombia and beyond, amplifying inequities. The study's approach has the potential to assess and monitor such issues in various contexts.<sup>27,29,74–76</sup>

This study's approach opens avenues for implementing accessibility monitoring and evaluation, suggesting periodic (e.g., annual, semestral) assessments and exploring the economics of different approaches to enhance accessibility. For instance, by informing land use and health services planning about adding services to existing public infrastructure, as tested in early AMORE web Platform prototypes.<sup>77</sup> The release of projected census data in 2024 allows updating these findings and integrating this approach into urban observatory networks.<sup>78,79</sup> This also presents a chance to promote community data initiatives involving intersectoral and multistakeholder collaboration. For instance, addressing the scarcity of data for informal settlements, popular neighbourhoods, or Cali's new districts to tackle health equity and social justice issues for populations that often lack a voice or remain neglected.<sup>26</sup> Another aspect involves applying the approach to promote accessibility to specialised radiotherapy services, such as brachytherapy.

Our findings emphasise the need to monitor demand, building on open and big data integration opportunities.<sup>19</sup> Epidemiological and economic studies could shape the services and capacities of new and existing radiotherapy facilities. Understanding current and predicted radiotherapy needs and expected trends for radiotherapy needs would benefit such deliberations.

Gaining knowledge on transport means used by patients and acting on factors influencing accessibility beyond travel times.<sup>41,80</sup> For example, distributing subsidies that address social justice or organizing mobility services to promote health services accessibility, especially for outlying urban areas.

Given the substantial demand adding these services in the appropriate locations would address, these findings underscore not only the urgent need for additional radiotherapy services that all residents can access but also highlight the importance of data-driven analysis for the location of new services. Unfortunately, there are no tertiary care level or large public hospitals adjacent to the sectors that optimise accessibility to radiotherapy. However, these insights provide valuable parameters for health services planning and strongly advocate re-evaluating land-use policies in Cali.

## Key results

The impact on health equity, as our findings show, is substantial and multifaceted. Our findings predict that adding strategically located radiotherapy services would dramatically enhance accessibility opportunities throughout the city, bringing them to levels currently found in low-traffic congestion situations. Our assessments highlight the challenges, and our predictions present viable

solutions plus crucial data that stakeholders across different levels of governance can use for advocacy, planning, and monitoring. These stakeholders include government authorities, civil society and opinion leaders, academics, advocates, and radiotherapy service providers and users. Of particular significance are those who actively engaged in this participatory research project.<sup>1,13,81,82</sup> We invite policymakers to consider adopting strategies like the one we reported to develop fairer transportation subsidies by grading them according to accessibility.

Our evaluations proved that a multistakeholder group supported by data scientists could generate repeated geographical accessibility assessments for three services for an entire city in an LMIC.<sup>19</sup> It was also possible to deliver these findings in a format relatable to participating stakeholders, making it feasible to communicate these findings to non-specialised audiences at diverse events and urban observatories.<sup>56,83</sup>

This study provides a valuable analysis of accessibility opportunities within the Colombian health system. It also sheds light on an accessible and rapid approach to estimating the impact of traffic congestion that could prove helpful to stakeholders and sectors (e.g., health, urban planning, smart city, economy) in planning for better health and equity and practical monitoring of geographical accessibility.<sup>18,69</sup>

#### Interpretation

These findings empower stakeholders to engage in informed, data-driven dialogues with land-use and health services planners. The overarching goal is to facilitate necessary improvements, bridging the health equity gap and ensuring universal access to healthcare.<sup>84</sup>

Care models for bustling cities should incorporate health service quality determinants, such as travel times. It is crucial to recognise that radiotherapy, typically involving comprehensive care, is inherently linked to delivering other services, including psychological support, rehabilitation therapies, nutritional guidance, pain management, and palliative care. Patients, therefore, require frequent access to these services, and health services planning requires considering the integration of services, including chemotherapy that might be given in combination with chemotherapy.<sup>37–39,73,85</sup> Future research could optimise the distribution of treatments with an integral perspective to minimise travel and service fragmentation and to provide continuity with established integral cancer treatment teams.<sup>73</sup>

Radiotherapy services are a sophisticated, expensive technology delivered by highly trained teams, with specialised radiotherapy modalities (e.g., 3D Conformal Radiotherapy, Intensity-Modulated Radiation Therapy, Image Guided Radiation Therapy, Stereotactic Body Radiation Therapy, Proton Therapy) beyond conventional radiotherapy (i.e., 2D Conformal Radiotherapy) There is an opportunity to look at the accessibility issues seeking to ensure a sound distribution of treatment modalities for existing service clusters and new centres to offer most common treatment options within reasonable travel times from where most of the population resides.<sup>39,85,86</sup>

In this context, balancing the advantages and disadvantages of centralising versus decentralising radiotherapy services is essential. The geographical segregation of populations in Cali and the concentration of services in areas with low population density disproportionately reduce service quality for those populations already hindered by a broad array of social determinants of health and result in geographic exclusion.<sup>87</sup>

Radiotherapy services are concentrated in the area from the north-to-south corridor of Cali to the west end of the valley where the city lies, leaving eastern Cali uncovered (Figures 2 and 3). Restrictions that prevent patients from accessing services available in every sector could further reduce accessibility. For instance, the Fundación Valle de Lilí radiotherapy service, in the southernmost part of Cali, is the sole provider for the densely populated southern areas of the city. Suppose a health maintenance organisation/insurer (EPS/EAPB, in Spanish) does not have a contract with this provider or assigns local patients in southern Cali to a different provider. In that case, neighbours will not benefit from its proximity. The low-accessibility and inequity gradients highlight the urgency of implementing reforms to address the fragmentation of health service delivery.

Testimonies from participatory community research teams and patients illustrate the plight of patients facing lengthy journeys for cancer and other high-cost treatments, such as haemodialysis.<sup>24,25,70</sup> Our findings suggest that swift, notable improvements are achievable through policies and actions that incentivise service providers and payers to broaden accessibility.

Strategically adding radiotherapy services will benefit the overall population across all economic strata and ethnic groups, with advantages for currently underserved groups (see Table 1, Table 2, Figure 9, and Figure 10). The evidence shows how adding two service sites increased the number of inhabitants within the 20-minute ACO in both assessments and across all economic strata and ethnic groups, notably impacting those currently underserved. Studies should be promoted to measure the direct and collateral economic impact of putting services within shorter travel times and distributing transportation subsidies with schemes that support social justice.

Colombian law requires the treatment of emergencies throughout the health system; thus, the fragmentation of health services might have yet to introduce bias in the published tertiary care emergency services assessment. However, such a law is not in place for chronic ambulatory services like radiotherapy; therefore, patients might only be able to access some radiotherapy-providing IPSs.<sup>7,88</sup> Colombia is undergoing a health reform, and assessments like this could provide insights for policy change, including free choice for radiotherapy providers.

We encourage readers to access the platform to test assumptions and scenarios. The interactive platform allows one to toggle or select specific radiotherapy providers.<sup>12,89</sup>

This and previous assessments done as part of the AMORE Project Collaboration's proof-of-concept show it is possible in LMICs to integrate open and big data to obtain dynamic geographical

accessibility assessments for health services, providing an equity perspective and following recommendations to communicate findings to multiple stakeholders better.<sup>1,7,70</sup>

#### Generalizability

The availability of travel-time big data allows for assessing various transportation modes. This approach applies to a broad spectrum of diagnoses and treatments, provided there is accessible georeferenced information. Like Colombia, other countries can harness available georeferenced open data of their population and services and integrate it with travel-time big data and TAZs to estimate ACOs. The resulting assessments could inform land-use and health services planning and contribute to aligning radiotherapy and other cancer treatments with universal health coverage.<sup>90</sup>

The public and private sectors can also adopt and refine this methodology by integrating information about population epidemiology, insurance providers, and payment agreements with health providers. These approaches are more complex and require investing in technology and participatory approaches for stakeholder engagement. For example, integrating additional data might help identify the service with the shortest journey and availability for a specific appointment time. It might also guide insurers' prioritisation of providers to expand their coverage or reduce fragmentation. When patients can access services in every sector offering them, accessibility will reach the levels we measured. As we reported in this study, the benefits of obtaining more precise and sophisticated assessments should be carefully weighed against the required resources, considering the high-level evaluation feasible with reduced funding and in a short time.

Notably, international policies and mandates are accelerating digitisation and datafication trends in many countries. This study's approach is transferable and can be replicated in other settings with traffic congestion, provided the essential data is available. Using population-weighed TAZ centroids instead of blocks reduces the overall costs associated with travel-time data while allowing for precise estimates.

Our methodology can be adapted to assess other transportation modes, services, and geographical areas. Such replication might involve downloading travel times for additional transport modes, adjusting traffic congestion models, population centroids within traffic analysis zones (TAZs), and refining predictive models.<sup>53</sup>

While this study included approaches for promoting sectoral advocacy, social adoption and application of knowledge in health services planning, such assessments go beyond the scope of this report.

## Limitations

This study seeks to identify the radiotherapy service with the shortest travel time. However, patients in Colombia are assigned to a health services provider institution (IPS in Spanish) under contract with the health promotion entity (EPS, in Spanish) or Benefits Plan Administration Company (EAPB) responsible for providing services to them.<sup>88</sup> It may result in reported accessibility rates exceeding

the accessibility individuals experience, which will be lower when EPS affiliation limits a patient's access to the services offering the shortest travel times. We had no access to georeferenced data on EPS/EAPB coverage for populations; therefore, our findings show cumulative opportunities instead of actual accessibility. This fragmentation introduces a potential bias in our findings.

This report does not consider the characteristics of individual radiotherapy services, their capacity, or which ones offer specialised brachytherapy services, for example. It also does not integrate service agreements or georeferenced patient information. Therefore, it provides a broad, optimistic assessment of accessibility. However, it reflects those populations that, even in the best-case scenario, would be beyond the assessed travel-time threshold. Nevertheless, it is possible to adjust for specific services by activating or deactivating services considered in the accessibility assessments in the AMORE Platform. For faster response, the published AMORE platform is set to identify locations that optimise accessibility with peak-traffic and all radiotherapy services activated.<sup>89</sup>

We did not include cost-effectiveness analyses or accurate demand and capacity estimates for new services.

Radiotherapy services are provided to the broader metropolitan area and neighbouring cities; this study focused on urban Cali.

#### Conclusions

This study advocates for using DGAMs to monitor accessibility in cities where traffic congestion might be amplifying inequities. It also demonstrates that predictions suitable for integrating health with urban and territorial planning can be made using open data. The engagement of local stakeholders improved the platform and the pertinence of the analysis options and placed the focus on the needs of data end users and beneficiaries.

The study pragmatically approached the singularities of bustling urban settings with a holistic approach considering the stakeholders, tensions, and challenges of territorial and health services planning. It measures accessibility per traffic congestion gradients with an equity perspective. It offers a simple and robust approach, provides baseline assessments, and predicts the impact of interventions building on readily accessible open data and accurate travel time big data.

The potential of improving accessibility to radiotherapy services for many patients stresses the urgency of acting on these data. We recommend prioritising new integrated radiotherapy or cancer care services in Cali's densely populated east, considering locations that maximise accessibility and health equity. Subsequent updates and evaluations will determine if adherence to integrated knowledge translation and social appropriation of knowledge principles lead to participatory urban and health services planning. They might also establish if services in eastern Cali will increase service referrals from the broader metropolitan area and neighbouring municipalities where radiotherapy is in short supply.

We sought the engagement and input of diverse stakeholders, including local government authorities and experts, health services planners, organised civil society groups such as academia and urban observatories, health service providers, health services user groups, and knowledge brokers.<sup>17,18</sup> The impact of such engagement differs from this report's focus.<sup>56</sup> The AMORE Project interactive interface is publicly available.<sup>12,15,53,81,91,92</sup>

# Other information

Health services planners could further research the effects of people-centred participatory approaches with multistakeholder engagement to seek stakeholder engagement in shaping urban and health services planning and social justice.

# Funding

This study received no external funding.

# **Ethical considerations**

This observational study integrates anonymised coded secondary data sources from publicly available open records. Colombia's census microdata used in this study and the location of approved selected health services obtained from REPS are publicly available.<sup>93,94</sup> The study protocol does not involve human subjects research and is considered "without risk" per Colombian law. The Commission on Ethics in Animal and Human Experimentation (CEEAH) of the Universidad del Valle in Cali and the Vice-Rector for Research, Universitat Autònoma de Barcelona (Ref: CEEAH-6100) cleared this project.<sup>53</sup>

Travel-time data used by the AMORE web-based platform is available from OpenScience [July DOI 10.17605/OSF.IO/XDA87 and November DOI 10.17605/OSF.IO/FMJ2X], and the interactive web-based interface of the AMORE Platform used for this report is publicly available at https://www.iquartil.net/proyectoAMORE/. Readers can interact with changing parameters and testing assumptions. A Padlet https://padlet.com/Proyecto\_AMORE\_Project/products offers access to the website, tutorials, databases, blogs, and presentations about the AMORE Project.

## Contributions and acknowledgements

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Luis Gabriel Cuervo integrated comments and sent them for professional editing to Stephen Volante before submitting them for a final round of comments and editions.

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Luis Gabriel Cuervo produced the first draft and used generative artificial intelligence (AI) and AIassisted technologies (Grammarly, ChatGPT) specifically to improve the readability and language of the first drafts. Stephen Volante, a member of the American Translators Association, professionally edited an advanced draft. The authors approved the draft for submission and take full responsibility for the content of this publication. Lead and senior authors invited collaborations from the AMORE Project's Collaboration members listed in the Padlet and other local experts and researchers. This article follows the STROBE – Cross-sectional studies format and checklist.

#### Disclaimer

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# References

- 1 Cuervo LG, Martínez-Herrera E, Cuervo D, Jaramillo C. Improving equity using dynamic geographic accessibility data for urban health services planning. *Gac Sanit* 2022; **36**: 497–9.
- 2 Macharia PM, Wong KLM, Olubodun T, *et al.* A geospatial database of close-to-reality travel times to obstetric emergency care in 15 Nigerian conurbations. *Sci Data* 2023; **10**: 736.
- 3 Mutono N, Wright JA, Mutunga M, Mutembei H, Thumbi SM. Impact of traffic congestion on spatial access to healthcare services in Nairobi. *Front Health Serv* 2022; **2**. https://www.frontiersin.org/articles/10.3389/frhs.2022.788173 (accessed April 19, 2023).
- 4 Moya-Gómez B, Salas-Olmedo MH, García-Palomares J, Gutiérrez J. Dynamic Accessibility using Big Data: The Role of the Changing Conditions of Network Congestion and Destination Attractiveness. *Netw Spat Econ* 2018; **18**. DOI:10.1007/s11067-017-9348-z.
- 5 INRIX. 2021 Global Traffic Scorecard. Inrix. 2022; published online Aug 29. https://inrix.com/scorecard/ (accessed Aug 29, 2022).
- 6 Reina Duque JC, Rojas Monsalve C. Determinación de zonas críticas a la atención de victimas severas de accidentes de tránsito entre el punto del evento y el centro asistencial.
  [Determination of critical areas for the care of severe victims of traffic accidents between the point of the event and the care center]. 2017; published online Nov 2. https://bibliotecadigital.univalle.edu.co/handle/10893/10481 (accessed Aug 29, 2022).
- 7 Cuervo LG, Martinez-Herrera E, Osorio L, *et al.* Dynamic accessibility by car to tertiary care emergency services in Cali, Colombia, in 2020: cross-sectional equity analyses using travel time big data from a Google API. *BMJ Open* 2022; **12**: e062178.
- 8 The Big Pitch LEAD 2023. 2023 https://youtu.be/rNgFYmJNp24?si=UiHfA-rq-h3YMDqo&t=3741 (accessed Sept 4, 2023).
- 9 Cuervo LG. A dynamic, interactive platform for assessing urban health services' accessibility and equity. In: Session L1: Bella Center, Copenhagen, Auditorium C1M3.: Institute of Healthcare Improvement and BMJ, 2023. DOI:10.6084/m9.figshare.23026166.
- 10Cuervo LG, Jaramillo Molina C, Cuervo D, *et al.* A new approach to assess equity in accessibility to health services. Oral presentation CPC2 Assuring access to health care for all. 2022; published online Nov 13. DOI:10.6084/m9.figshare.21548235.
- 11Canadian Institutes of Health Research. Guide to knowledge translation planning at CIHR:
   integrated and end-of-grant approaches. Ottawa: Canadian Institutes of Health Research, 2012.
   12Whitty CJM. What makes an academic paper useful for health policy? *BMC Med* 2015; 13: 301.

- 13 Rifkin SB. Pursuing Primary Health Care: Community Participation in Practice, Doing Participatory Research. *JSM Health Educ Prim Health Care* 2016; **1**.
- 14 Israel BA, Schulz AJ, Parker EA, *et al.* Chapter 3. Critical issues in developing and following CBPR Principles. In: Wallerstein N, Duran B, Oetzel J, Minkler M, eds. Community-Based Participatory Research for Health: Advancing Social and Health Equity., Third Edition. San Francisco, CA: Jossey-Bass, 2017: 31–44.
- 15 Goldstein S, Mabry RM, Friedman EA, Sales ALL de F, Castro A. Achieving and Maintaining Equitable Health Outcomes for all, Including for Future Generations. *Int J Soc Determinants Health Health Serv* 2023; : 27551938231214984.
- 16Papa E, Coppola P, Angiello G, Carpentieri G. The learning process of accessibility instrument developers: Testing the tools in planning practice. *Transp Res Part Policy Pract* 2017; **104**: 108–20.
- 17 Shelton RC, Brownson RC. Enhancing Impact: A Call to Action for Equitable Implementation Science. *Prev Sci* 2023; published online Oct 25. DOI:10.1007/s11121-023-01589-z.
- 18 Ramanadhan S, Davis MM, Armstrong R, *et al.* Participatory implementation science to increase the impact of evidence-based cancer prevention and control. *Cancer Causes Control* 2018; **29**: 363–9.
- 19Cuervo LG, Wilde J, Alburez-Gutiérrez D. Analyzing Big Data on a Shoestring Budget. 2023; published online March 27. https://www.prb.org/articles/analyzing-big-data-on-a-shoestringbudget/ (accessed May 26, 2023).
- 20Buzai GD. Análisis espacial en geografía de la salud: resoluciones con sistemas de informacion geográfica, 1st edn. Buenos Aires: Lugar Editorial, 2015.
- 21 Kajalić J, Čelar N, Stanković S. Travel Time Estimation on Urban Street Segment. *Promet TrafficTransportation* 2018; **30**: 115–20.
- 22AccessMod 5 | Modelling physical accessibility to health care. accessmod. https://www.accessmod.org (accessed May 3, 2021).
- 23Soltani A, Inaloo RB, Rezaei M, Shaer F, Riyabi MA. Spatial analysis and urban land use planning emphasising hospital site selection: a case study of Isfahan city. *Bull Geogr Socio-Econ Ser* 2019; **43**: 71–89.
- 24 Populab. Video Participativo: Movilidad Comuna 18 Cali, Colombia (6m:28s). Cali, Colombia, 2022 https://www.youtube.com/watch?v=4fUgx7osKfw (accessed Nov 17, 2022).
- 25GREAT Gridding equitable urban futures in areas of transition. https://wp.lancs.ac.uk/great/ (accessed Sept 10, 2022).

- 26 Voices of Popular Neighbourhoods heard through GREAT project. Lanc. Univ. https://www.lancaster.ac.uk/partners/news/voices-of-popular-neighbourhoods-heardthroughgreat-project (accessed Dec 29, 2023).
- 27 Castaño López LD, Montoya Agudelo MA, Montoya Bolívar N. Gasto de bolsillo de las familias y pacientes con cáncer, afiliados al régimen subsidiado y atendidos en el Hospital Pablo Tobón Uribe durante el año 2020. 2021. https://bibliotecadigital.udea.edu.co/handle/10495/20681 (accessed Dec 21, 2023).
- 28 Chicaiza Daza AP. Condiciones de acceso a los medicamentos oncológicos ambulatorios en las pacientes con cáncer de mama afiliadas a una Empresa Administradora de planes de beneficio Regional Cali 2019. 2021. https://bibliotecadigital.univalle.edu.co/entities/publication/13148d11-9949-4b25-86a8b67d435ce8b2 (accessed Dec 21, 2023).
- 29 Vargas J J, Molina M G. Acceso a los servicios de salud en seis ciudades de Colombia: limitaciones y consecuencias. *Rev Fac Nac Salud Pública* 2009; **27**: 121–30.
- 30 Diario del AltoAragón. La distancia, obstáculo en el acceso al tratamiento de radioterapia [Distance, an obstacle in access to radiotherapy treatment]. diariodelaltoaragon.es. https://www.diariodelaltoaragon.es/noticias/sociedad/2020/07/13/la-distancia-obstaculo-enelacceso-al-tratamiento-de-radioterapia-1213910-daa.html (accessed Jan 3, 2024).
- 31 Acceso al tratamiento de Radioterapia en España | AECC Observatorio. https://observatorio.contraelcancer.es/informes/acceso-al-tratamiento-de-radioterapiaenespana (accessed Jan 3, 2024).
- 32 Puerto Pedraza HM. Soporte social percibido en cuidadores de familires de personas en tratamiento contra el cáncer [Social support perceived in family caretakers of patients being treated against cancer]. *Rev Cuid* 2017; **8**: 1407–22.
- 33 Palacios A, Rojas-Roque C, González L, *et al.* Direct Medical Costs, Productivity Loss Costs and Out-Of-Pocket Expenditures in Women with Breast Cancer in Latin America and the Caribbean: A Systematic Review. *PharmacoEconomics* 2021; **39**: 485–502.
- 34Thomson MD, Van Houtven CH, Xu R, Siminoff LA. The many "costs" of transportation: Examining what cancer caregivers experience as transportation obstacles. *Cancer Med* 2023; **12**: 17356–64.
- 35 Hanna TP, Shafiq J. Estimating the Population Benefit of Radiotherapy: Using Demand Models to Estimate Achievable Cancer Outcomes. *Clin Oncol* 2015; **27**: 99–106.
- 36Riedl D, Gastl R, Gamper E, *et al.* Cancer patients' wish for psychological support during outpatient radiation therapy. *Strahlenther Onkol* 2018; **194**: 655–63.

- 37 Scirocco E, Cellini F, Donati CM, et al. Improving the Integration between Palliative Radiotherapy and Supportive Care: A Narrative Review. *Curr Oncol* 2022; **29**: 7932–42.
- 38Sirohi B, Chalkidou K, Pramesh CS, et al. Developing institutions for cancer care in low-income and middle-income countries: from cancer units to comprehensive cancer centres. *Lancet Oncol* 2018; 19: e395–406.
- 39 Presentación del libro Cáncer de Mama, oportunidad de vida,..la vida continúa. [Presentation of the book Breast Cancer, opportunity for life,...life goes on]. Bogota DC, 2023 https://www.youtube.com/live/c-eVPUKzi5Q?si=CwLlQo71wSYYUe3y&t=2469 (accessed Dec 5, 2023).
- 40Gallardo Solarte K, Benavides Acosta FP, Rosales Jiménez R. Costos de la enfermedad crónica no transmisible: la realidad colombiana. *Rev Cienc Salud* 2016; **14**: 103–14.
- 41 Hande V, Chan J, Polo A. Value of Geographical Information Systems in Analyzing Geographic Accessibility to Inform Radiotherapy Planning: A Systematic Review. *JCO Glob Oncol* 2022; : e2200106.
- 42 Ministerio de Salud y Protección Social de Colombia. Preguntas Frecuentes todos. 2023; published online Nov 21. https://www.minsalud.gov.co/Lists/FAQ/todos.aspx?Paged=TRUE&p\_ID=1086&PageFirstRow= 91&&View=%7B33CD7DE6-6D6A-46F4-9185-527C9C226B29%7D (accessed Nov 21, 2023).
- 43 Piquero Villegas F. Opportunities Amidst Uncertainty: My life with one kidney and without it. Pg. 85. In: Opportunities amidst uncertainty: my life with one kidney and without it. Middletown, DE, USA: The Ghost Publishing, 2021. https://isbnsearch.org/isbn/9781737235088.
- 44T-101-21 Corte Constitucional de Colombia. https://www.corteconstitucional.gov.co/relatoria/2021/T-101-21.htm (accessed Nov 21, 2023).
- 45T-736-16 Corte Constitucional de Colombia. https://www.corteconstitucional.gov.co/relatoria/2016/t-736-16.htm (accessed Nov 21, 2023).
- 46 Moist LM, Bragg-Gresham JL, Pisoni RL, *et al.* Travel Time to Dialysis as a Predictor of HealthRelated Quality of Life, Adherence, and Mortality: The Dialysis Outcomes and Practice Patterns Study (DOPPS). *Am J Kidney Dis* 2008; **51**: 641–50.
- 47 Atun R, Jaffray DA, Barton MB, *et al.* Expanding global access to radiotherapy. *Lancet Oncol* 2015; **16**: 1153–86.
- 48Jaffray DA, Knaul FM, Atun R, *et al.* Global Task Force on Radiotherapy for Cancer Control. *Lancet Oncol* 2015; **16**: 1144–6.
- 49Goyal S, Chandwani S, Haffty BG, Demissie K. Effect of Travel Distance and Time to Radiotherapy on Likelihood of Receiving Mastectomy. *Ann Surg Oncol* 2015; **22**: 1095–101.

- 50 Baade PD, Dasgupta P, Aitken JF, Turrell G. Distance to the closest radiotherapy facility and survival after a diagnosis of rectal cancer in Queensland. *Med J Aust* 2011; **195**: 350–4.
- 51Abimbola S, Negin J, Jan S, Martiniuk A. Towards people-centred health systems: a multi-level framework for analysing primary health care governance in low- and middle-income countries. *Health Policy Plan* 2014; **29**: ii29–39.
- 52Sheikh K, George A, Gilson L. People-centred science: strengthening the practice of health policy and systems research. *Health Res Policy Syst* 2014; **12**: 19.
- 53 Cuervo LG, Jaramillo C, Cuervo D, *et al.* Dynamic geographical accessibility assessments to improve health equity: protocol for a test case in Cali, Colombia. F1000Research. 2022; **11**: 17.
- 54Kwan M-P. Space-Time and Integral Measures of Individual Accessibility: A Comparative Analysis Using a Point-based Framework. *Geogr Anal* 1998; **30**: 191–216.
- 55 Cuervo LG, Cuervo D, Hatcher-Roberts J, *et al.* AMORE Project: Integrated knowledge translation and geospatial analysis to improve travel times to health services (accessibility) and health equity in Cali, Colombia: a proof of concept using mixed-methods research. Thesis Commons, 2021 DOI:10.31237/osf.io/4atqc.
- 56AMORE Project Collaboration coordinators, Cuervo LG, Jaramillo C, Villamizar CJ, Martinez Herrera E. AMORE Project portfolio. Padlet AMORE Proj. Portf. 2023; published online Jan 26. https://padlet.com/Proyecto\_AMORE\_Project/products (accessed Oct 16, 2023).
- 57 Dirección de Censos y Demografía DCD,, Departamento Administrativo Nacional de Estadística DANE. COLOMBIA Censo Nacional de Población y Vivienda CNPV 2018. Bogotá: Departamento Administrativo Nacional de Estadística DANE, 2020.
- 58DANE. Información técnica y omisión censal 2018, aspectos conceptuales y metodológicos. 2019. https://www.dane.gov.co/index.php/estadisticas-por-tema/demografia-ypoblacion/censo-nacional-de-poblacion-y-vivenda-2018/informacion-tecnica (accessed Sept 10, 2020).
- 59 Mapas de Comunas. http://www.cali.gov.co/publicaciones/115924/mapas\_comunas\_idesc/ (accessed May 30, 2020).
- 60 Unión Temporal UT SDG-CNC. Encuesta de movilidad de hogares Cali 2015: Producto 3. Ámbito y<br/>zonificación.2015;<br/>publishedpublishedonlineMay.https://www.metrocali.gov.co/wp/wpcontent/uploads/2019/02/Encuesta-de-movilidad-<br/>2015.pdf (accessed May 30, 2020).20
- 61Distance Matrix API APIs & Services Google Cloud Platform. https://console.cloud.google.com/apis/library/distancematrixbackend.googleapis.com?filter=solution-

type:service&filter=visibility:public&filter=category:maps&id=82aa0d98-49bb-4855-9da9efde390a3834&folder=true&organizationId=true&supportedpurview=project (accessed July 22, 2020).

- 62 Google Maps, Cuervo LG. Location of haemoidalysis, radiotherapy, and tertiary care emergency services in Cali, Colombia, 2021. 2021; published online Jan. https://tinyurl.com/445fczyz (accessed Sept 25, 2021).
- 63 DANE Información técnica Censo Nacional de Población y Vivienda 2018. 2023; published online Dec 21. https://www.dane.gov.co/index.php/estadisticas-por-tema/demografiaypoblacion/censo-nacional-de-poblacion-y-vivenda-2018/informacion-tecnica (accessed Dec 21, 2023).
- 64Cali Distrito se moverá entre siete y ocho localidades. http://www.cali.gov.co/publicaciones/146733/cali-distrito-se-movera-entre-siete-yocholocalidades/ (accessed April 24, 2021).
- 65 Cali Distrito Especial tendría seis localidades. http://www.cali.gov.co/publicaciones/148406/calidistrito-especial-tendria-seis-localidades/ (accessed March 31, 2021).
- 66Alcaldía de Santiago de Cali. Cali Distrito Especial. 2022; published online Feb 24. https://www.cali.gov.co/publicaciones/146724/cali-distrito-especial/ (accessed April 5, 2022).
- 67Cali Distrito Especial, aprobado en primer debate del Concejo. https://www.cali.gov.co/publicaciones/177528/cali-distrito-especial-aprobado-enprimerdebate-del-concejo/ (accessed Nov 21, 2023).
- 68 World Health Organization. Health as the pulse of the new urban agenda: United Nations conference on housing and sustainable urban development, Quito, October 2016. Geneva: World Health Organization, 2016 https://iris.who.int/handle/10665/250367 (accessed Jan 15, 2024).
- 69UN-Habitat, World Health Organization. Integrating health in urban and territorial planning: a sourcebook. Geneva: World Health Organization, 2020 https://apps.who.int/iris/handle/10665/331678 (accessed April 11, 2022).
- 70Cuervo LG, Villamizar CJ, Osorio L, *et al.* Assessing Equity in Accessibility to Haemodialysis
   Services by Automobile in Cali, Colombia: Cross-sectional Analyses Using Publicly Available Data.
   2023; published online March 10. DOI:10.2139/ssrn.4299562.
- 71 Fiscella K, Shin P. The Inverse Care Law: Implications for Healthcare of Vulnerable Populations. J Ambulatory Care Manage 2005; 28: 304–12.
  72 Hart JT. The inverse care law. The Lancet 1971; 297: 405–12.

- 73 Barrios C, Sánchez-Vanegas G, Villarreal-Garza C, *et al.* Barriers and facilitators to provide multidisciplinary care for breast cancer patients in five Latin American countries: A descriptive interpretative qualitative study. *Lancet Reg Health Am* 2022; **11**: 100254.
- 74Carrasco-Escobar G, Manrique E, Tello-Lizarraga K, Miranda JJ. Travel Time to Health Facilities as a Marker of Geographical Accessibility Across Heterogeneous Land Coverage in Peru. *Front Public Health* 2020; **8**. https://www.frontiersin.org/article/10.3389/fpubh.2020.00498 (accessed April 4, 2022).
- 75 Musselwhite C. Improving Mobility in Marginalised Communities. *Future Transp* 2023; **3**: 1347–59.
- 76 Wang J, Wong KLM, Olubodun T, *et al.* Developing policy-ready digital dashboards of geospatial access to emergency obstetric care: a survey of policymakers and researchers in sub-Saharan Africa. *Health Technol* 2023; published online Dec 7. DOI:10.1007/s12553-023-00793-9.
- 77DS4A Colombia 2020 / Grand Finale. 2020 https://youtu.be/sdjJWz9BqiQ?t=7362 (accessed Aug 16, 2020).

78 Red de Ciudades Cómo Vamos |. https://redcomovamos.org/ (accessed Dec 21, 2023).

- 79 Red de Ciudades Cómo Vamos (RCCV) | Fundación Corona. https://www.fundacioncorona.org/es/lo-que-hacemos/educacion-para-laparticipacionciudadana/red-de-ciudades-como-vamos-rccv (accessed Dec 21, 2023).
- 80 Moradi S, Najafi M, Mesgari S, Zolfagharinia H. The utilization of patients' information to improve the performance of radiotherapy centers: A data-driven approach. *Comput Ind Eng* 2022; **172**: 108547.
- 81Abimbola S. Beyond positive a priori bias: reframing community engagement in LMICs. *Health Promot Int* 2020; **35**: 598–609.
- 82 Wallerstein N, editor. Community-based participatory research for health: advancing social and health equity, Third edition. Hoboken, NJ: Jossey-Bass & Pfeiffer Imprints, Wiley, 2017.
- 834° Foro de Ciudades Cómo Vamos Lima Cómo Vamos. Lima Cómo Vamos Presentación del Proyecto AMORE: Uso de análisis geoespacial dinámico en diálogos de actores clave para mejorar la accesibilidad a los servicios de salud de uso urgente o frecuente, y reducir desigualdades. Prueba de concepto en Cali, Colombia. 2021; published online Nov 4. https://www.facebook.com/limacomovamos/photos/a.171309686231837/5117762341586522 / (accessed Nov 4, 2021).

84 United Nations, Department of Economic and Social Affairs, Statistical Division. SDG Indicators

- Global indicator framework for the Sustainable Development Goals and targets of the 2030
   Agenda for Sustainable Development. 2023; published online Jan 9.
   https://unstats.un.org/sdgs/indicators/indicators-list/ (accessed Jan 9, 2023).
- 85 Portafolio Instituto Nacional de Cancerología. https://www.cancer.gov.co/portafolio-1 (accessed Dec 28, 2023).
- 86 Ajithkumar T. Radiotherapy Planning, Oxford, UK. Oxford University Press, 2023 https://doi.org/10.1093/med/9780198722694.002.0004.
- 87 Luz G, Portugal L. Understanding transport-related social exclusion through the lens of capabilities approach. *Transp Rev* 2022; **42**: 503–25.
- 88OECD. Health and health care in Colombia. In: OECD Reviews of Health Systems: Colombia 2016. Paris, 2016: 37.
- 89 IQuartil SAS, AMORE Project. AMORE Project website IQuartil SAS. 2021; published online Nov 2. https://www.iquartil.net/proyectoamore/ (accessed Nov 13, 2022).
- 90Abdel-Wahab M, Fidarova E, Polo A. Global Access to Radiotherapy in Low- and Middle-income Countries. *Clin Oncol* 2017; **29**: 99–104.
- 91LEAD Agile Session Setup Backlog. 2023 https://www.youtube.com/watch?v=lz8tQqQbkqE (accessed Sept 4, 2023).
- 92Turner S, D'Lima D, Hudson E, *et al.* Evidence use in decision-making on introducing innovations: a systematic scoping review with stakeholder feedback. *Implement Sci IS* 2017; **12**: 145.
- 93 Ministerio de Salud. Resolución 8430 de 1993: Normas científicas, técnicas y administrativas para la investigación en salud. 1993; published online Oct 4. https://www.minsalud.gov.co/sites/rid/Lists/BibliotecaDigital/RIDE/DE/DIJ/RESOLUCION-8430DE-1993.pdf.
- 94 World Health Organization, Council for International Organizations of Medical Sciences. International ethical guidelines for health-related research involving humans. Geneva: CIOMS, 2017 https://www.who.int/docs/default-source/ethics/webciomsethicalguidelines.pdf?sfvrsn=f62ee074\_0.
- 95 Data Science Training | Data Science for All: Colombia | C1 Insights. https://www.correlationone.com/blog/data-science-for-all-colombia-graduates-500-new-dataprofessionals (accessed May 14, 2021).

20-min accessibility rates to radiotherapy drop as traffic congestion grows.



Supplemental material Recording: <u>https://youtu.be/IQsGmbGWyZI</u>

**Tables** 

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20-min accessibility opportunity to radiotherapy services	Jul 2020 (%)	Add 1 Location	Variation vs baseline	Add 2 Locations	Variation vs baseline	Benefit of 2 vs 1 location	Nov 2020 (%)	Add 1 Location	Variation vs baseline	Add 2 Locations	Variation vs baseline	Benefit of 2 vs 1 location	Population
	30.8%	61.6%	30.8%	82.6%	51.8%	21.0%	60.4%	91.5%	31.1%	99.4%	39.0%	7.9%	
Socio-economic stratum													
Low	11.2%	47.6%	36.4%	80.5%	69.3%	32.9%	42.8%	88.7%	45.9%	99.6%	56.8%	10.8%	1,109,549
Middle	42.8%	73.7%	30.8%	84.1%	41.3%	10.4%	75.0%	95.3%	20.3%	100.0%	25.0%	4.7%	935,699
High	82.6%	83.0%	0.4%	87.3%	4.8%	4.4%	89.5%	89.9%	0.4%	96.3%	6.8%	6.4%	204,589
N.D.	30.3%	55.6%	25.3%	76.7%	46.4%	21.1%	58.5%	84.5%	26.1%	97.3%	38.8%	12.8%	8,986
Ethnicity													
Afrodescendent	15.2%	53.7%	38.5%	85.2%	70.0%	31.5%	42.8%	88.9%	46.1%	99.8%	57.1%	11.0%	325,865
Rrom (nomadic)	24.5%	53.9%	29.4%	74.5%	50.0%	20.6%	53.9%	89.2%	35.3%	95.1%	41.2%	5.9%	102
Indigenous	28.9%	53.0%	24.1%	70.9%	42.0%	17.9%	67.5%	94.9%	27.3%	98.9%	31.3%	4.0%	11,112
Islander/Raizal	40.3%	64.1%	23.8%	80.4%	40.1%	16.2%	64.7%	91.1%	26.4%	98.2%	33.5%	7.1%	382
Other (Caucasian, Mestizo)	33.4%	63.0%	29.6%	82.2%	48.8%	19.2%	63.3%	92.0%	28.7%	99.4%	36.1%	7.4%	1,890,491
Palenque	11.0%	19.2%	8.2%	78.8%	67.8%	59.6%	78.8%	87.8%	9.0%	100.0%	21.2%	12.2%	245
N.D.	41.3%	63.6%	22.3%	82.9%	41.6%	19.3%	68.4%	90.5%	22.3%	97.9%	29.5%	7.3%	30.626
Educational level													
Graduate degree	67.4%	77.3%	9.9%	84.5%	17.0%	7.2%	84.1%	91.9%	7.8%	97.8%	13.7%	5.9%	72.441
Bachelor Degree	53.1%	72.6%	19.6%	84.2%	31.2%	11.6%	76.7%	92.7%	16.0%	99.0%	22.4%	6.4%	295.319
Technical	32.8%	64.5%	31.8%	83.9%	51.1%	19.4%	63.4%	92.2%	28.8%	99.7%	36.3%	7.5%	244,160
Middle	25.7%	60.0%	34.3%	87.7%	57.0%	22.7%	56.3%	91.4%	35.1%	99.6%	43.3%	8.2%	608.429
High School	24.3%	58.1%	33.8%	82.2%	57.9%	24.0%	55.7%	91.7%	35.5%	99.5%	43.8%	8.4%	337.065
Primary	23.3%	57.2%	33.9%	81.2%	57.8%	23.9%	55.5%	91.5%	36.0%	99.5%	44.1%	8.0%	468,206
Pre-school	25.1%	56.5%	31.4%	81.6%	56.5%	25.1%	55.8%	89.5%	33.7%	99.3%	43.5%	9.8%	36,294
No data	27 5%	58.0%	30.5%	81.6%	54 1%	23.6%	57.1%	90.3%	33 2%	99.3%	42.2%	8.9%	195 909
Literary	27.370	50.070	30.070	01.075	57.270	23.070	37.170	50.575	33.278	33.370	76.670	0.576	150,505
Literate	31.4%	67.1%	20.8%	\$2.7%	51 /194	20.6%	50.9%	01.7%	2/1 294	00.4%	22.5%	7 9%	2 0/3 0/1
Noliteracu	21 1%	52.1%	21.4%	70 9%	59 79/	20.0%	57 7%	90.7%	27.0%	00 5%	AE 8%	0.9%	2,043,041
N A	24.5%	57.0%	32.5%	81 7%	57 194	24.6%	54 7%	00 1%	35.4%	00.5%	40.8%	0.4%	121 140
N D	41.6%	65 3%	72.7%	\$7.9%	41 792	17 5%	57.0%	on 9%	77.0%	07.0%	20.1%	7.1%	28 250
Condex/Eex	41.0/0	03.376	23.170	02.070	41.270	17.5%	07.5%	50.870	22.376	31.370	30.170	7.170	26,235
Gender/Sex	21.29/	61.09/	20.69/	00 70/	E1 E0/	20.0%	60.69/	01.5%	20.06/	00.49/	20.0%	7.0%	1 209 617
Fem	31.2%	61.8%	30.0%	82.7%	51.5%	20.9%	60.6%	91.5%	30.9%	99.4%	38.9%	7.9%	1,208,617
Masc	50.4%	01.4%	51.0%	82.376	52.1%	21.1%	60.2%	91.5%	51.5%	99.4%	39.270	7.9%	1,050,206
Civil status	20.7%	64.00/	00.70/	00.40/	54 70/	21.00/	60.64	04.70/	04.004	00.50/	22.0%	7.00/	001 505
Single	30.7%	61.3%	30.7%	82.4%	51.7%	21.0%	60.5%	91.7%	31.0%	99.5%	38.8%	7.8%	821,536
Married or cohabitation	31.3%	61.9%	30.6%	82.6%	51.3%	20.7%	60.5%	91.4%	30.9%	99.4%	38.9%	7.9%	896,958
Divorced or separated	33.3%	64.9%	31.6%	84.2%	51.0%	19.3%	62.6%	92.6%	30.0%	99.6%	37.0%	7.1%	163,980
Widow	37.3%	66.8%	29.5%	84.8%	47.5%	17.9%	66.5%	93.2%	26.7%	99.6%	33.1%	6.4%	95,611
N.A.	24.6%	57.1%	32.6%	81.5%	56.9%	24.4%	54.9%	90.2%	35.3%	99.5%	44.5%	9.3%	254,492
N.D.	41.7%	64.8%	23.1%	82.7%	41.0%	17.8%	68.4%	90.9%	22.5%	97.8%	29.5%	6.9%	26,246
Age													
0-4	24.6%	57.0%	32.5%	81.7%	57.1%	24.6%	54.7%	90.1%	35.4%	99.5%	44.8%	9.4%	121,140
0-14	24.6%	57.3%	32.7%	81.5%	56.9%	24.2%	55.0%	90.2%	35.3%	99.4%	44.4%	9.2%	400,527
5-14	24.6%	57.4%	32.8%	81.4%	56.8%	24.0%	55.1%	90.3%	35.2%	99.4%	44.3%	9.1%	279,387
15-24	27.1%	59.0%	31.8%	81.7%	54.5%	22.7%	57.6%	91.1%	33.5%	99.4%	41.8%	8.3%	363,311
15-59	30.3%	61.3%	31.0%	82.4%	52.1%	21.1%	60.1%	91.5%	31.3%	99.4%	39.3%	8.0%	1,482,069
15-64	30.8%	61.6%	30.8%	82.5%	51.7%	20.9%	60.4%	91.5%	31.1%	99.4%	39.0%	7.9%	1,595,016
60+	39.6%	67.6%	28.0%	84.6%	45.0%	17.0%	67.4%	93.2%	25.7%	99.5%	32.0%	6.3%	376,227
65+	40.7%	68.4%	27.7%	84.8%	44.1%	16.4%	68.6%	93.6%	24.9%	99.5%	30.9%	5.9%	263,280
80+	44.4%	70.7%	26.2%	85.6%	41.2%	14.9%	73.1%	94.6%	21.5%	99.6%	26.5%	5.0%	64,100

Table 1. Relative figures: situational analysis and predicted 20-minute ACO by car to radiotherapy in Cali in July and November 2020

20-min accessibility opportunity to radiotherapy services	Jul 2020 (#)	Add 1 Location	Variation vs baseline	Add 2 Locations	Variation vs baseline	Benefit of 2 vs 1 location	Nov 2020 (#)	Add 1 Location	Variation vs baseline	Add 2 Locations	Variation vs baseline	Benefit of 2 vs 1 location
	696,327	1,391,829	695,502	1,865,381	1,169,054	473,552	1,364,832	2,067,450	702,618	2,245,876	881,044	178,426
Socio-economic stratum											_	
Low	123,977	527,803	403,826	892,794	768,817	364,991	474,595	984,401	509,806	1,104,619	630,024	120,218
Middle	400,720	689,313	288,593	786,990	386,270	97,677	701,804	891,483	189,679	935,418	233,614	43,935
High	168,909	169,720	811	178,706	9,797	8,986	183,180	183,971	791	197,097	13,917	13,126
N.D.	2,721	4,993	2,272	6,891	4,170	1,898	5,253	7,595	2,342	8,742	3,489	1,147
Ethnicity												
Afrodescendent	49,557	174,905	125,348	277,654	228,097	102,749	139,457	289,643	150,186	325,366	185,909	35,723
Rrom (nomadic)	25	55	30	76	51	21	55	91	36	97	42	6
Indigenous	3,211	5,889	2,678	7,881	4,670	1,992	7,504	10,542	3,038	10,987	3,483	445
Islander/Raizal	154	245	91	307	153	62	247	348	101	375	128	27
Other (Caucasian, Mestizo)	630,694	1,191,204	560,510	1,553,869	923,175	362,665	1,196,437	1,738,850	542,413	1,878,821	682,384	139,971
Palenque	27	47	20	193	166	146	193	215	22	245	52	30
N.D.	12,659	19,484	6,825	25,401	12,742	5,917	20,939	27,761	6,822	29,985	9,046	2,224
Educational level												
Graduate degree	48,842	55,998	7,156	61,184	12,342	5,186	60,924	66,580	5,656	70,880	9,956	4,300
Bachelor Degree	156,669	214,438	57,769	248,721	92,052	34,283	226,424	273,619	47,195	292,496	66,072	18,877
Technical	80,075	157,600	77,525	204,845	124,771	47,246	154,822	225,088	70,266	243,462	88,640	18,374
Middle	156,269	365,144	208,875	503,350	347,081	138,205	342,481	556,196	213,715	606,040	263,559	49,844
High School	81,902	195,958	114,056	276,927	195,025	80,969	187,782	307,293	119,511	335,498	147,715	28,205
Primary Pro school	109,257	207,945	11 402	360,013	270,750	0.120	239,723	426,320	100,597	466,001	200,278	2,001
Ne data	9,105	114 120	11,402 60,021	160 71 2	105 505	3,120	20,245	177 992	12,220	105 469	13,700	17 595
Notata	34,208	114,235	00,031	100,715	100,505	40,474	112,435	177,003	03,430	199,408	63,033	17,565
Literacy	640.804	1 200 424	629,620	1 000 000	1.040.399	420.008	1 244 426	1 972 051	C20 C1C	2,021,000	797 170	159.555
Literate No literacy	640,804	1,209,424	20,950	1,690,092	1,049,288	420,008	24 056	1,873,051	028,015	2,031,606	21 074	158,555
No interacy	14,004	54,675	20,805	09.027	50,343 60 1 75	20,000	56,254	109 202	4,500	120 567	54,074	11 265
N.A.	23,/32	18 459	5,521	23 409	11 642	4 950	19 176	25 661	6.485	27 673	8 497	2 012
Conder/Sex	11,767	10,435	0,052	23,405	11,042	4,550	15,170	25,001	0,405	27,075	0,437	2,012
Gender/Sex	277.042	747.020	260.096	000.360	622.226	252 240	723.364	1 105 265	274.001	1 201 820	460 556	05.555
Mass	310,043	644 800	225 516	955,303	EAE 779	232,340	622 559	061 195	279,517	1,201,820	403,330	93,333
Civil status	319,204	0-1-1,800	323,310	800,012	340,720	221,212	032,305	501,105	526,017	1,044,030	411,400	02,071
Civil status	353 027	503.966	251 920	676 676	434 600	172 770	409.055	752 109	255.042	P17 220	210.154	64.112
Single Married or cobabitation	252,027	555 269	231,033	740 502	424,009	185 234	438,000	820.054	233,042	817,220	248 525	71 757
Divorced or separated	54 547	106 410	51.952	129 122	433,680	21 722	102 647	151 790	40 122	162 270	546,525	11 500
Widow	35,666	63,904	28,238	81.064	45 398	17 160	63 585	89 100	25 515	95 199	31 514	6,099
NA	62 522	145 365	87 843	207 350	144 828	51 985	139,805	229 555	89 750	253 100	112 205	23 545
N.D.	10 949	17,015	6.067	21,697	10 748	4 681	17 943	23,853	5 910	25 676	7 733	1 823
Ago	10,545	17,010	0,007	21,001	10,740	4,001	11,040	23,033	0,010	23,010	1,133	2,023
0-4	29 752	69.073	30 321	98 97 7	69.175	29.854	66 264	109 202	42 938	120 567	54 303	11 365
0-14	08 479	229 461	130 983	326 457	227.979	96,906	220 182	361 450	141 276	398 149	177.965	36 689
5-14	68,726	160.388	91.662	227,530	158 804	67.142	153,919	252,257	98.338	277.581	123.662	25,324
15-24	98,577	214,216	115,639	296.675	198,099	87.460	209,280	330.960	121.680	361.028	151.748	30.068
15-59	449.040	908.079	459.039	1.220.688	771.648	312.609	890,955	1.355.432	464,477	1.473.500	582,545	118.068
15-64	490.654	982,231	491.577	1.315.601	824.947	333.370	963,917	1.459.675	495,758	1.585,770	621.853	126.095
60+	148,809	254,289	105,480	318.236	169.427	63,947	253.694	350.559	96.865	374,228	120.534	23.669
65+	107,195	180,137	72,942	223,323	116,128	43,186	180,732	246,316	65,584	261,958	81,226	15,642
80+	28,489	45,315	16,826	54,875	26,386	9,560	46,869	60,627	13,758	63,828	16,959	3,201

Table 2 Absolute figures: situational analysis and predicted 20-minute ACO by car to radiotherapy in Cali in July and November 2020

# Figures

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#### Improving accessibility to radiotherapy services in Cali, Colombia: cross-sectional equity analyses using Open Data and Big Data Travel Times from 2020. [Preprint]



Figure 1: AMORE web-based Platform demographics interface (absolute figures)



### Figure 2. Cali's 2020 population distribution by housing economic stratification and travel time

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Figure 3: Location of radiotherapy services in 2020.

This preprint research paper has not been peer reviewed. Electronic copy available at: https://ssrn.com/abstract=4722439

#### Improving accessibility to radiotherapy services in Cali, Colombia: cross-sectional equity analyses using Open Data and Big Data Travel Times from 2020. [Preprint]



Figure 4 20-minute ACO by car to radiotherapy 6–12 July 2020 (relative)



Figure 5 20-minute ACO by car to radiotherapy 23–29 November 2020 (relative)



Figure 6. Assessed accessibility in July and November 2020 by economic stratum and location. Column height represents the TAZ population.

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# Figure 7 Accessibility gradients by house economic stratum with peak vs free-flow traffic (6–12 July 2020)

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Figure 8. Locations to optimise urban accessibility, adding services in one vs. two sectors.

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# Figure 9. Assessment and predictions for accessibility improvement by housing income stratum for two measurements: July and November 2020

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Figure 10. Assessment and predictions for accessibility improvement for the three largest ethnic groups in Cali: July and November 2020

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Figure 11 Interface with the relative effects of adding services in a location per July data



Figure 12 Interface with the relative effects of adding services in two locations per July data