#### SHORTEST PATH FINDING ALGORITHM TO PREVENT STREET HARASSMENT

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### **ABSTRACT**

The streets are a vital space for the development of society, but the interactions that take place there are not always great. Sexual harassment is a fact, and it is our duty to fight it. This paper presents the creation of an algorithm aimed at solving the need to find routes that are short in distance, involving the least amount of street harassment possible. The project is contextualized in the present, while providing some background (similar algorithms) in order to show previously developed alternatives besides our support for the fight against sexual street harassment.

# **Key words**

Shortest route, street sexual harassment, identification of safe routes, crime prevention

### 1. INTRODUCTION

Sexual harassment is a problem that has been present in our society for decades. We tend to think of solutions such as increasing education levels or increasing penalties or punishments for those who commit such an act, but science has a different approach. Different factors have led to develop a solution from technology, since many daily processes are involved by this, it can be a great tool to fight this problem. We propose an algorithm that takes into account the distance and the level of harassment in the streets of Medellín, in order to find the best route that a person can take when going from a point A to a point B. The proposed method does not leave aside the ideas presented at the beginning of this section, but complements them.

# 1.1. The problem

The problem we are facing is the creation of an algorithm that identifies the three shortest and safest paths, in order to reduce the crime and sexual harassment risk pedestrians face on a daily basis. Thereby, the likelihood of these encounters will decrease; this will let pedestrians, especially vulnerable groups like women and children, feel safe while walking towards their destination.

### 1.2 Solution

The solution suggested is three pedestrian paths that reduce both distance and the risk of harassment. From the algorithms presented in this work, the Depth First Search and Breadth First Search algorithms were discarded given that they were not designed to find the shortest path or safest path. Additionally, they cannot be applied to weighted graphs, therefore, they are not useful for this particular problem. Instead, the Dijkstra algorithm was selected and modified. Since Dijkstra's algorithm specifically finds all the shortest paths from a node to every single point in a graph, it is crucial to modify it so that it stops when the target destination is reached. Simultaneously, a weight variable composed of a combination of the distance and the harassment risk was considered in order to generate a route that creates a balance of these two factors.

For all three paths, the same algorithm is used. Only the parameter of weight that is passed to the function is changed. This weight expresses the length and risk in three different ways, fusing them through different operations as a means to get diverse results for a short and safe path.

### 1.3 Structure of the article

Next, in Section 2, we present work related to the problem. Then, in Section 3, we present the datasets and methods used in this research. In Section 4, we present the algorithm design. Then, in Section 5, we present the results. Finally, in Section 6, we discuss the results and propose some directions for future work.

### 2. RELATED WORK

Below, we explain four works related to finding ways to prevent street sexual harassment and crime in general.

# **2.1 Urban Navigation Beyond Shortest Route: The Case Of Safe Paths**

This study is labeled as an intelligent urban navigation work and it was focused on the cities of Chicago and Philadelphia, generating a bicriteria solution to the safest and shortest path problem. The two factors taken into consideration were the length and risk of the route. For the construction of the algorithm, data from OpenStreetMap (OSM) was exported and publicly available crime information was recollected.

The algorithm is recursive, and was based mostly on the Dijkstra solution. This algorithm proved a great performance, as shown in the results through efficiency and efficacy. Finally, the program displays not only one but rather a small subset of the best path options for the pedestrian to choose from. [1]

# 2.2 Proposing A Multi-Criteria Path Optimization Method In Order To Provide A Ubiquitous Pedestrian Wayfinding Service

This study presents a more complete method of calculating paths tailored to pedestrians. Put to test in Tehran, Iran, this method focused on context and user awareness to give the best path option. These two factors are then broken down into four criteria: length, safety, difficulty and attraction. The last three also have, inside each one of them, diverse categories that take into account the user's age, gender, infrastructure preference, as well the street's width and slope. The above, with the intention to deliver the best result personalized for each user.

This method made use of the Dijkstra algorithm. The four factors go through a mathematical model, where they are added and generate one final path option. [2]

# 2.3 SafeJourney: A Pedestrian Map Using Safety Annotation For Route Determination

This paper showcases the creation and implementation of a website to calculate the best route for students at Universiti Teknologi PETRONAS, a private university in Malaysia. The scope of the project was small, only focused on the commute students have to do inside the campus, e.g. from one block to another and so on.

The solution was mainly based on the Dijkstra algorithm. The website was built using XHTML, PHP and MySQL to display the best path highlighted on the university's campus map. It also shows step by step instructions through text and images. [3]

# **2.4 Shortest Path Algorithms for Pedestrian Navigation Systems**

This work presents a penalty-based algorithm to calculate the shortest and most accessible path for people with reduced mobility, emphasizing mostly on wheelchair users.

The algorithm is based on the k shortest paths model (KSP), while also contemplating factors like the road's pavement state, its width, and whether it is a ramp or not. The 10 shortest paths are calculated and then the most accessible one is chosen to be delivered to the user. The method was tested in the city of Thessaloniki, in Greece, proving great performance in most of the conducted experiments. [4]

### 3. MATERIALS AND METHODS

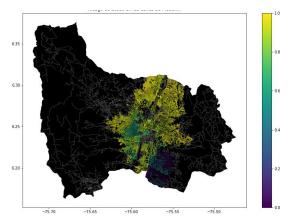
In this section, we explain how the data were collected and processed, and then different alternative path algorithms that reduce both the distance and the risk of sexual street harassment.

## 3.1 Data collection and processing

The map of Medellín was obtained from *Open Street Maps* (OSM)<sup>1</sup> and downloaded using the Python API<sup>2</sup> OSMnx. The map includes (1) the length of each segment, in meters;

(2) the indication of whether the segment is one-way or not, and (3) the known binary representations of the geometries obtained from the metadata provided by OSM.

For this project, a linear combination (LC) was calculated that captures the maximum variance between (i) the fraction of households that feel insecure and (ii) the fraction of households with incomes below one minimum wage. These data were obtained from the 2017 Medellín quality of life survey. The CL was normalized, using the maximum and minimum, to obtain values between 0 and 1. The CL was obtained using principal components analysis. The risk of harassment is defined as one pminus the normalized CL. Figure 1 presents the calculated risk of bullying. The map is available on GitHub<sup>3</sup>.



**Figure 1.** Risk of sexual harassment calculated as a linear combination of the fraction of households that feel unsafe and the fraction of households with income below one minimum wage, obtained from the 2017 Medellín Quality of Life Survey.

# 3.2 Algorithmic alternatives that reduce the risk of sexual street harassment and distance

In the following, we present different algorithms used for a path that reduces both street sexual harassment and distance.

### 3.2.1 Depth First Search

The Depth First Search (DFS) is an algorithm for deeply searching or exploring graphs or trees. [5] The execution of the algorithm begins at the root node, examining each branch before backtracking. It uses a stack data structure to get the

<sup>&</sup>lt;sup>1</sup> https://www.openstreetmap.org/

<sup>&</sup>lt;sup>2</sup> https://osmnx.readthedocs.io/

<sup>&</sup>lt;sup>3</sup>https://github.com/mauriciotoro/ST0245Eafit/tree/master/proyecto/Datasets

subsequent vertex, and to start a search, whenever a deadend appears in any iteration. [6]

Because depth-first search constantly grows until the deepest node in the current branch of the search tree, we implement it using the LIFO queue, often known as a stack. According to Norvig and Russell [7]:

"A LIFO queue means that the most recently generated node is chosen for expansion. This must be the deepest unexpanded node because it is one deeper than its parent — which, in turn, was the deepest unexpanded node when it was selected."

One notorious problem we may encounter with DFS is the possibility of having the target node next to the current node, but since DFS goes to the end of each branch, we cannot reach it until that branch is fully explored.

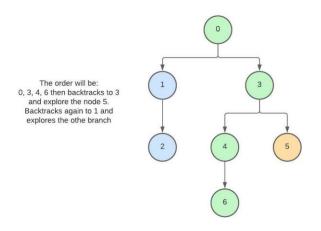


Figure 2. DFS Algorithm.

### 3.2.2 Breadth First Search

Breadth-first search (BFS) is an algorithm that is used for searching or exploring graphs or trees [8]. This algorithm selects a single node (initial or source point) in a graph and then visits all the nodes adjacent to the selected node. BFS accesses these nodes one by one. Once the algorithm visits and marks the starting node, it moves towards the nearest unvisited nodes and analyses them [9]. These iterations continue until all the nodes of the graph have been successfully visited and marked, or until the goal is reached.

BFS implements the FIFO queue (first in, first out) because when queried, returns the oldest element, based on the order they were inserted [8].

The BFS algorithm helps to solve the problem left by DFS.

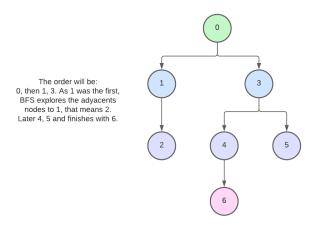


Figure 3. BFS Algorithm.

### 3.2.3 Dijkstra's Shortest Path Algorithm

Dijkstra's algorithm is one way to find the shortest route across a weighted graph from a starting node to a target node. This procedure builds a tree of all the shortest routes from the source, or first vertex, to every other point in the graph. By calculating the travel time to each linked node, Dijkstra's algorithm determines the shortest path. It then records the edge's distance in a list, placing the shortest at the top, and begins exploring other nodes in the order of that list. Just until the destination node is reached, this process stops [10].

This method differs from the others in that it provides the shortest distance, whereas DFS and BFS just provide an answer to whether a node is connected to another.

One significant problem with this algorithm is the fact that even if the shortest path is the better option, sometimes that's not the way you can get to the target node. This algorithm does not have any orientation variable [11].

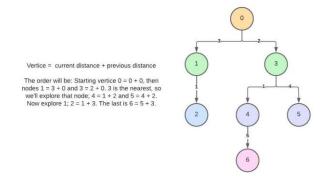


Figure 4. Dijkstra's algorithm.

### 3.2.4 A\* (A Star algorithm)

A\* (pronounced A Star) is a popular pathfinding and graph traversal technique. In order to make more optimum decisions, the A\* algorithm adds heuristic to a standard graph-searching algorithm, essentially planning ahead at each step so a more optimal decision is made. Like Dijkstra, A\* constructs a lowest-cost path tree from the start node to the destination node, but it differs from Dijkstra in the way it utilizes a function called f(n) for each node to estimate the overall cost of a path by adding the edge cost and a heuristic variable. In this instance, that outcome will be at the front of our queue [12].

The heuristic variable helps to avoid the problem Dijkstra has. With 2 variables in game the judgment is better.

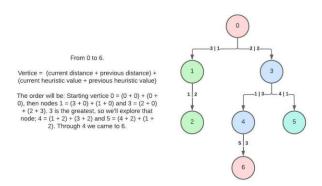


Figure 5. A\* Algorithm.

# 4. ALGORITHM DESIGN AND IMPLEMENTATION

In the following, we explain the data structures and algorithms used in this work. The implementations of the data structures and algorithms are available on Github<sup>4</sup>.

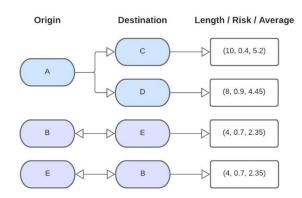
# 4.1 Data Structures

The data of the streets of Medellín was given in a CSV file. Firstly, all of the information was translated to a Pandas DataFrame. Then, an adjacency list was implemented using Python dictionaries.

This adjacency list was preferred over an adjacency matrix due to the type of graph of this particular case. For instance, the map of Medellín could be categorized as a sparse graph, since each street is only directly connected to a few other streets, thus, an adjacency list is more efficient in terms of storage [13].

The adjacency list was carried out with Python dictionaries to represent the weight of each edge in the graph. To illustrate, for every key, or origin in the DataFrame, there are multiple destinations. Likewise, for every destination there is a length, a harassment risk, and an additional variable that combines both of them. The above corresponds to the path cost for each edge in the graph.

The data structure is presented in Figure 6.



Those in purple have the parameter "oneway" in "True" so the algorithm that creates and fill the graph make a dictionary for both sides.

Figure 6. Graph as an adjacency list with dictionaries.

### 4.2 Algorithms

In this paper, we propose an algorithm for a path that minimizes both the distance and the risk of street sexual harassment.

# 4.2.1 Algorithm for a pedestrian path that reduces both distance and risk of sexual street harassment

The implemented algorithm was Dijkstra, as it offers simplicity and speed. The parameters sent to the function are the graph, the origin and the target destination. The latter consists of a tri-tuple where the first slot is occupied by the length, the second by the harassment risk, and the third one by a mixture of both.

First and foremost, the algorithm creates two dictionaries. The first one has the distances between each vertex and its predecessor, but all values are initialized to infinity since the length is not known yet. The other dictionary initializes the predecessors of all vertices to "None", except for the origin. The distance between the origin and its predecessor is zero, so we need specify that.

Subsequently, a priority queue is created. This is a queue that differs from a conventional queue. It inherently stores elements by an order, this is, from smallest to largest. The first elements introduced to the priority queue are the origin and its length.

<sup>&</sup>lt;sup>4</sup> https://github.com/sneusar/ST0245-002

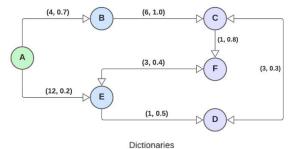
As long as the priority queue is not empty, the algorithm will keep running. Meanwhile, we use the pop() method to get the first element in the queue, and its values will be stored in a length variable and a current vertex variable. This current vertex will be constantly changing throughout the algorithm according to the elements being introduced and extracted from the priority queue. It is important to note that this current vertex has adjacent nodes, and we are going to compare them and their distances in an internal loop.

Now, the loop employs a variable called distance which gets updated with every iteration. This variable adds the distance between the origin and the current node (the predecessor of the adjacent node) and the distance between the current node and its adjacent. If this distance is smaller than the one that was calculated previously, this value will be introduced to the priority queue, otherwise, it will not. As seen in the beginning, all distances are defined as infinite, so we will replace this with values that arise during the process.

At last, an empty stack is created and this is returned along with the dictionary of the predecessors. This information will be useful later on to store the predecessors of the target destination and eventually graph all of them with the help of an external function. This function is critical since Dijkstra finds the predecessors of many routes, not only the one to the target, so we start searching recursively for the predecessors of the destination until we reach the origin.

The algorithm is exemplified in Figure 7.

### Example execution: Origin: A, Destination: D



Vertex	Path	Cost	
А	None	0	
В	А	2.35	
С	С	5.85	
D	E	6.85	
E	A	6.1	
F	С	6.75	

Information	1"	2°
From:	С	Е
To:	D	F
Cost:	6.85	7.8

Priority queue

Figure 7. Dijkstra's algorithm using a priority queue.

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