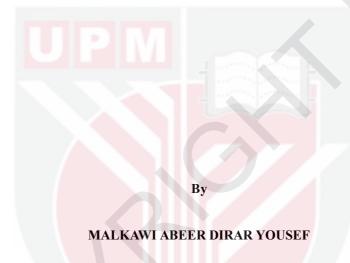


# TERRAIN AWARENESS MOBILITY MODEL TO SUPPORT OUTDOOR MOBILITY FOR PEOPLE WITH VISION IMPAIRMENT



Thesis Submitted to the School of Graduate Studies, University Putra Malaysia, in Fulfilment of the Requirements for the Degree of Doctor of Philosophy

November 2023

FSKTM 2023 9

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Abstract of thesis presented to the Senate of Universiti Putra Malaysia in fulfilment of the requirement for the degree of Doctorate of Philosophy

## TERRAIN AWARENESS MOBILITY MODEL TO SUPPORT OUTDOOR MOBILITY FOR PEOPLE WITH VISION IMPAIRMENT

By

#### MALKAWI ABEER DIRAR YOUSEF

### November 2023

Chairman : Azrina binti Kamaruddin, PhD

Faculty : Computer Science and Information Technology

Vision impairment is defined as any degree of impairment to a person's ability to see that affects his or her daily life. Changes in the ground surface (presence of terrain types) represent a significant challenge for people with vision impairment (PVI). While enormous research work proposed valuable solutions that improved PVI mobility, most of these studies investigated detecting obstacles above the ground and addressing navigation problems, with an insufficient investigation into terrain hazards. In addition to the lack of spatial information provided, which is mostly limited to vibration or audio signals. To address this gap, this study developed a Terrain Awareness Mobility Model (TAM2) to support outdoor mobility for PVI. TAM2 aims to improve terrain awareness by incorporating providing spatial information during mobility. The provided information improves instant mobility performance and facilitates the formation of the cognitive map of the environment, which can support safe and independent outdoor mobility. In this study, the User-Centred Design (UCD) approach was adopted, which involved engaging the target group throughout all research phases. The research design applied the exploratory mixed method, comprising qualitative research, then proposed the solution according to the findings, and finally, evaluated the solution quantitatively. To gather the users' requirements and expectations, a qualitative study was conducted with two groups of participants. The first group consisted of four experts whose job is to empower the life quality of PVI, while the second group comprised 15 participants with vision impairment. The study utilized three research instruments during this phase, a semi-structured interview, a mobility observation session in a familiar environment, and a mobility observation session in an unfamiliar environment. Thematic analysis was applied, and the findings outlined the primary components of TAM2. TAM2 contains three main components; user model, terrain detection model, and learning model. For the prototyping phase, the study employed the deep learning detection framework YOLOv4-tiny algorithm to implement a real-time terrain detection model. This detection model was integrated with an Android detection app to detect specific types of terrain. Additionally, the app was equipped with a speech message feedback function to convey spatial information, including terrain type, direction, and approximate distance.

Furthermore, a real-world quasi-experiment was conducted with 14 participants with vision impairment to evaluate TAM2 effectiveness through the app. The experiment measured the terrain type detection performance and feedback effectiveness, in addition to the usability of the app. Quantitative analysis via the Mann-Whitney U test technique with p-value = 0.05 was applied to assess the mobility performance improvement and cognitive map formation. The analysis revealed a statistically significant improvement in the users' mobility performance and cognitive map formation for the users who utilized the app. Additionally, the questionnaire descriptive analysis revealed that 71.4% of the participants agreed with the app's effectiveness and usability. This result indicates that TAM2 is able to support outdoor mobility for PVI. The terrain detection app can be used by the PVI community to improve their terrain awareness. As well the provided measurement methods can assist stakeholders in teaching locomotion for PVI. Moreover, TAM2 can serve as a roadmap for researchers investigating mobility for PVI, outlining the main requirements of the target group and how to achieve these requirements to progress the research. This could lead to the development of ATs that are better suited to PVI requirements (e.g., ATs that complement the white cane) and more usable that improve outdoor mobility for PVI. Accordingly, TAM2 and the terrain detection app represent the key contribution of this study.

Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai memenuhi keperluan untuk ijazah Doktor Falsafah

## MODEL MOBILITI KESEDARAN TERAIN UNTUK MENYOKONG MOBILITI LUAR BAGI ORANG CACAT PENGLIHATAN

Oleh

#### MALKAWI ABEER DIRAR YOUSEF

### November 2023

Pengerusi : Azrina binti Kamaruddin, PhD

Fakulti : Sains Komputer dan Teknologi Maklumat

Kecacatan penglihatan ditakrifkan sebagai sebarang tahap kecacatan kepada keupayaan penglihatan seseorang yang menjejaskan kehidupan sehariannya. Perubahan pada permukaan tanah (kewujudan jenis terain) merupakan cabaran yang signifikan bagi orang yang cacat penglihatan (PVI). Manakala kerja penyelidikan yang besar mengesyorkan penyelesaian yang berguna bagi memperbaiki mobiliti PVI, kebanyakan kajian tersebut menyelidiki pengesanan halangan di atas tanah dan menangani masalah navigasi, dengan penyelidikan yang tidak mencukupi mengenai bahaya terain. Selain kekurangan maklumat spatial yang disediakan, yang kebanyakannya terhad kepada getaran atau isyarat audio. Untuk mengatasi jurang tersebut, kajian ini membangunkan Model Mobiliti Kesedaran Terain (TAM2) bagi menyokong mobiliti luar untuk PVI. TAM2 bertujuan untuk memperbaiki kesedaran terain melalui penginkorporasian penyediaan maklumat ruangan ketika mobiliti. Maklumat yang diberi dapat meningkatkan prestasi mobiliti segera dan memudahkan pembentukan peta kognitif persekitaran, yang dapat menyokong mobiliti luar yang selamat dan independen. Dalam kajian ini, pendekatan Reka Bentuk Berpusatkan Pengguna (UCD) telah diterima pakai, yang melibatkan penglibatan kumpulan sasaran di sepanjang semua fasa penyelidikan. Reka bentuk penyelidikan mengaplikasi kaedah campuran eksploratori, terdiri daripada penyelidikan kualitatif, kemudian mengesyorkan penyelesaian bergantung kepada dapatan, dan akhirnya, menilai penyelesaian tersebut secara kuantitatif. Bagi mengumpul keperluan dan ekspektasi pengguna, kajian kualitatif telah dijalankan dengan dua kumpulan partisipan. Kumpulan pertama terdiri daripada empat pakar yang kerja mereka adalah untuk memperkasakan kualiti hidup PVI, manakala kumpulan kedua terdiri daripada 15 partisipan yang cacat penglihatan. Kajian ini menggunakan tiga instrumen penyelidikan ketika fasa ini, temu bual separa berstruktur, sesi pemerhatian mobiliti dalam persekitaran yang biasa, dan sesi pemerhatian mobiliti dalam persekitaran yang tidak biasa. Analisis tematik telah diaplikasikan, dan dapatan menggariskan komponen primer bagi TAM2. TAM2 mengandungi tiga komponen utama; model pengguna, model pengesanan terain, dan model pembelajaran. Bagi fasa pemprototaipan, kajian ini menggunakan rangka pengesanan pembelajaran mendalam

YOLOv4-algoritma kecil bagi mengimplentasi model pengesanan terain masa sebenar. Model pengesanan ini telah diintegrasikan dengan app pengesanan Android bagi mengesan jenis terain yang spesifik. Di samping itu, app tersebut telah dilengkapi dengan fungsi maklum balas mesej pertuturan bagi menyampaikan maklumat ruangan, termasuk jenis terain, tunjuk arah, anggaran jarak. Tambahan pula, eksperimen dunia sebenar telah dijalankan dengan 14 partisipan yang cacat penglihatan bagi menilai keberkesanan TAM2 melalui app tersebut. Percubaan mengukur prestasi pengesanan jenis rupa bumi dan keberkesanan maklum balas, di samping kebolehgunaan apl. Analisis Kuantitatif melalui teknik ujian Mann-Whitney U dengan nilai p = 0.05 telah diaplikasikan bagi menilai penambahbaikan prestasi mobiliti dan pembentukan peta kognitif. Analisis memperlihatkan penambahbaikan yang signifikan secara statistik dalam prestasi mobiliti pengguna dan pembentukan peta kognitif bagi pengguna yang memanfaatkan app tersebut. Selain itu, analisis deskriptif soal selidik mendedahkan bahawa 71.4% daripada peserta bersetuju dengan keberkesanan dan kebolehgunaan aplikasi. Dapatan kajian menunjukkan bahawa TAM2 berupaya untuk menyokong mobiliti luar bagi PVI. App pengesanan terain dapat digunakan oleh komuniti PVI bagi meningkatkan kesedaran mereka mengenai terain. Di samping itu kaedah penilaian yang disediakan dapat membantu pemegang taruh dalam pengajaran pergerakan bagi PVI. Lebih-lebih lagi, TAM2 dapat berfungsi sebagai peta hala tuju bagi penyelidik yang menyelidiki mobiliti bagi PVI, menggariskan keperluan utama kumpulan sasaran dan cara untuk mencapai keperluan tersebut bagi memajukan penyelidikan. Ini boleh membawa kepada pembangunan AT yang lebih sesuai dengan keperluan PVI (cth., AT yang melengkapkan tongkat putih) dan lebih boleh digunakan yang meningkatkan mobiliti luar untuk PVI. Sehubungan itu, TAM2 dan aplikasi pengesanan rupa bumi mewakili sumbangan utama kajian ini.

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This thesis was submitted to the Senate of the Universiti Putra Malaysia and has been accepted as fulfilment of the requirement for the degree of Doctor of Philosophy. The members of the Supervisory Committee were as follows:

### Azrina binti Kamaruddin, PhD

Senior Lecturer Faculty of Computer Science and Information Technology Universiti Putra Malaysia (Chairman)

### Novia Indriaty Admodisastro, PhD

Associate Professor, Ts.
Faculty of Computer Science and Information Technology
Universiti Putra Malaysia
(Member)

### Alfian bin Abdul Halin, PhD

Senior Lecturer
Faculty of Computer Science and Information Technology
Universiti Putra Malaysia
(Member)

### ZALILAH MOHD SHARIFF, PhD

Professor and Dean School of Graduate Studies Universiti Putra Malaysia

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### LIST OF ABBREVIATIONS

ADL Activities of Daily Living

API Application Programming Interface

AR Augmented Reality

AT Assistive Technology

CBR Community Base Rehabilitation instructor

CNN Convolutional Neural Network

COCO Common Objects In Context

CVI Content Validity Index

EOA Electronic Orientation Aid

ETA Electronic Travel Aid

FCN Fully Convolutional Network

GIS Geographic Information System

GPS Global Positioning System

GPU Graphics Processing Unit

HCD Human-Centered Design

ICT Information Communication Technology

I-CVI Item-Content Validity Index

IPSAD Interactive and Portable Sidewalk Assistive Device

IR Infrared

JKEUPM Ethics Committee Research Involving Human Subjects

LiDAR Light Detection and Ranging

MAB Malaysian Associations for Blind

mAP mean Average Precision

MLP Multilayer Perceptron

NCBM National Council for the Blind, Malaysia

O&M Orientation and Mobility

OKU Orang Kurang Upaya

PLD Position Locator Device

PVI People with Vision Impairment

R&D Research and Development department

R-CNN Region Convolutional Neural Network

ResNet Residual Neural Network

RNN Recurrent Neural Network

SA Situation Awareness

S-CVI Scale-Content Validity Index

SD Standard Deviation

SIFT Scale Invariant Feature Transform

SoV Sound of Vision

TAM2 Terrain Awareness Mobility Model

TAWS Terrain Awareness and Warning System

TDA Terrain Detection App

TDM Terrain Detection Model

UA Universal Agreement

UCD User-Centred Design

VI Vision Impairment

VR Virtual Reality

WD Wearable Device

WHO World Health Organization

YOLO You Only Look Once

### **CHAPTER 1**

### INTRODUCTION

In the last two decades, significant research efforts have been directed toward facilitating outdoor mobility for people with vision impairment (PVI). These efforts have mainly focused on developing obstacle detection and wayfinding techniques, which have significantly advanced the field. However, limited attention has been given to addressing the critical issue of improving terrain awareness for PVI. To bridge this research gap, this study examines three key areas: outdoor mobility for PVI, terrain awareness mobility models, and computerized support. The integration of these domains offers a comprehensive solution to enhance terrain awareness for PVI. This introduction chapter comprises various sections that serve distinct purposes. Section 1.1 presents the motivation for conducting this study. Section 1.2 explains the problem statement. Section 1.3 puts forth the research questions that the study seeks to address. Section 1.4 outlines the research objectives that the study aims to achieve. Section 1.5 discusses the study scope. Section 1.6 explains the contributions that the study makes to the existing knowledge. Lastly, Section 1.7 presents the organization of the thesis, which provides a roadmap for the subsequent chapters.

### 1.1 Motivation

According to statistics provided by the World health organization (WHO), in 2022, there are approximately one billion individuals worldwide who are experiencing some degree of vision impairment, a significant proportion (80%) of which could potentially be treated, as stated by the (WHO, 2022). Consequently, it can be inferred that around 200 million PVI should adapt to this condition on a daily base, which can adversely impact their ability to carry out routine activities and increase their reliance on others for assistance, thereby posing a potential threat to their life.

Outdoor mobility in an unfamiliar environment is one of the severe challenges PVI faces daily. It is one of the primary factors that impact their quality of life economically and socially (Hersh & Johnson, 2008; Meza-de-Luna et al., 2019). Researchers have indicated that most PVI rely on accompanying a sighted person to visit an unfamiliar place (Pissaloux & Velázquez, 2017); Banovic et al. (2013). Consequently, improving mobility for PVI has drawn enormous attention in both academia and industry over the past two decades. Numerous assistive technologies have been developed to accomplish mobility challenges faced by PVI. However, the proposed systems primarily emphasized detecting and avoiding obstacles above the ground and solving navigation problems, as reported by (Bai et al., 2019; Bochsler et al., 2013).

In contrast, diverse terrain types constitute a tangible hazard with direct implications for the safety, independence, and proficient navigation of individuals with VI (Chai et al., 2018; Smith et al., 1992). These perils have the potential to exert a considerable influence on pivotal aspects such as employment prospects, overall health, and involvement in social activities within the specified demographic.

Despite the potential risk associated with terrain types, this study determined a lack in the literature regarding investigating and providing solutions for PVI to avoid terrain hazards and improve their terrain awareness.

Moreover, the revolution of deep learning techniques and their effective detection performance in real-time inspired researchers to employ this technology to assist PVI in reducing the influence of disability on daily life.

Therefore, the primary motivation of this research work is to employ information technology to propose a solution that aims to improve PVI's terrain awareness and support their safe and independent outdoor mobility, which could reduce the former challenges and enhance their quality of life.

#### 1.2 Problem Statement

The first problem found in the literature body is that changes in the ground surface (presence of terrain type) represent a significant risk factor that impacts the physical safety of PVI. According to Walter (Walter et al., 2013), the level of changes on a flat surface for a 4 cm step or 3 cm slope is considered a critical hazard for PVI, as cited by (Cloix et al., 2016). The challenges of terrain types for PVI are compounded by the limitation of the most popular conventional traveling aid (i.e., white cane) to detect these types in several situations. This limitation stems from the movement and tipping way of the cane during navigation, as well as the terrain type size (Hersh & Johnson, 2008; Pissaloux & Velázquez, 2017). Smith's research identified terrain hazards as one of the top five mobility problems PVI faces daily (Smith et al., 1992). Furthermore, most warning signs for terrain types are typically visual in nature, whereas the urban environment has been designed primarily for sighted individuals (Johnston, 2013).

Many studies have proposed both theoretical and practical solutions that support mobility for PVI to a large extent. However, the majority of these research works focused on detecting and avoiding obstacles above the ground while avoiding addressing potential ground hazards, such as stairs and holes (Bai et al., 2019; Chai et al., 2018). Despite the significant challenges the PVI community struggles with regarding terrain hazards, insufficient research was conducted to identify the factors that impact PVIs' mobility due to terrain types and propose solutions that improve terrain awareness. Some research works involve terrain types within their scope, but their primary aim has been detecting obstacles, with only limited types of terrain included within these obstacles. For instance, the research involved detecting stairs (Kunta et al. 2020; Sun et al. 2019; Bashiri et al. 2018) and included potholes (Ahmed et al. 2018; Khan Kundu et al. 2018), where these studies are limited in scope to address terrain types.

On the other hand, this research endeavors to provide a conceptual and practical solution that bridges the existing gap in improving terrain awareness to support safe outdoor mobility for PVI. This research strives to address the terrain challenges based on PVI requirements, as perceived by experts who work to empower PVI life quality and participants from the PVI community.

The second problem in the mobility for the PVI domain is the limited safety spatial information provided to the PVI. Providing PVI with sufficient information during navigation can improve their mobility performance to protect their safety (Pearson et al., 2015). However, several researchers highlighted that the majority of existing solutions for PVI provide low-level information, which falls short of meeting the spatial information that PVI requires for safe mobility in terms of obstacle detection and environmental awareness (Chen et al. 2021; Pissaloux et al., 2017; Banovic et al., 2013).

Massive research studies have proposed systems that convey feedback in the form of haptic (Chai et al., 2018) or acoustic warning (Tachiquin et al., 2021; K. Yang, Wang, et al., 2018) to assist the individual in navigation. However, such feedback mechanisms are unreliable in providing even the minimum required spatial information unless it is to warn of an imminent hazard. A diverse range of spatial information is necessary to improve the user's terrain awareness, which generates a clear comprehension and perception of the environmental structure (K. Yang, Wang, et al., 2018; R. Yang et al., 2011). Meanwhile, spatial knowledge theories consider understanding the environment structure induced by the user's perception and then followed by reaction (Pissaloux & Velázquez, 2017; Spiers, 2016).

El-Taher's research argued that the speech message constitutes the most widely used feedback mechanism in recent studies (El-Taher et al., 2021). In contrast, the provided information has been mostly limited to navigation guidance, such as instructions to turn left or move right in the Van Der study (Van Der Bie et al., 2019) or obstacle presence warning (e.g., "stop, obstacle detected") (Sim et al., 2019), and identifying the obstacle's name without providing the necessary details such as direction, for instance, "stairs" (Chandra et al., 2020; Yang, Wang, et al., 2018).

However, this study proposed a speech message feedback mechanism to convey more comprehensive and direct information, considering avoiding the potential for overwhelming data (Hersh & Johnson, 2008). The delivered information includes the terrain type, direction (up or down), and the estimated distance to reach it. Such information can significantly stimulate the users' awareness of the terrain type in front of them. Hence, they recognize the presence of a nearby hazard that causes them to navigate carefully to find this terrain type, then verify and tackle it safely and effectively. Providing individuals with sufficient information assists them in understanding the surrounding environment and can play a pivotal role in improving their terrain awareness (Rachburee & Punlumjeak, 2021; K. Yang, Bergasa, et al., 2018)

The third problem we found in the literature pertains to the lack of providing PVI with adequate perception of various types of terrain in the surrounding environment, which can facilitate the formation of the cognitive map. This is due to the limited scope of previous studies according to the tackled number of terrain types, where many studies addressed either a single type of terrain (Tan et al., 2019; Sun et al., 2019) or only two types of terrain (Kunta et al., 2020; Yang Bergasa et al., 2018; Chai et al., 2018). Consequently, while such studies may provide individuals with instant mobility assistance, they offer limited spatial knowledge of the surrounding environment.

Researchers agreed that cognitive map formation required imagery of environmental elements and spatial relations among these elements, such as distance, directions, and scales (Kitchin, 2015; Kitchin & Blades, 2002). Therefore, collecting spatial information about more elements enables individuals to generate more spatial relations and a robust perception of the environment. Hersh has highlighted the limitation of many travel aids by the lack of providing PVI with a spatial comprehension of the environment (Hersh, 2016). Furthermore, Banovic has pointed out that most research works provide users with information for immediate requirements, disregarding the need for information that can aid in cognitive map formation (Banovic et al., 2013).

This study investigated four terrain types, including potholes, drains, ascending stairs, and descending stairs. These structures can function as cues and landmarks that PVI can memorize and use to establish relationships among them from one side and with the environment from another side. These relations facilitate individuals' ability to generate the cognitive map, as Quiñones mentioned based on Lynch's findings in 1960 (Quiñones et al., 2011).

The current study aims to offer PVI sufficient information about the terrain type they are approaching during navigation. This information prompts individuals to search for the mentioned terrain type and directly contact it to collect additional necessary information, such as depth or height, to tackle the situation safely. This process enables PVI to engage in spatial learning using both resources-based and navigation-based strategies simultaneously. We hypothesize that this approach will improve the formation of the cognitive map, improve terrain awareness, and ultimately support outdoor mobility for PVI.

As a result, the existing research regarding terrain awareness for the PVI field is inadequate to provide effective outdoor mobility for the target group. Therefore, there is a necessity to develop a terrain mobility model that can overcome this gap and support outdoor mobility for the PVI community. Figure 1.1 illustrates the interrelated points of the problem statement.

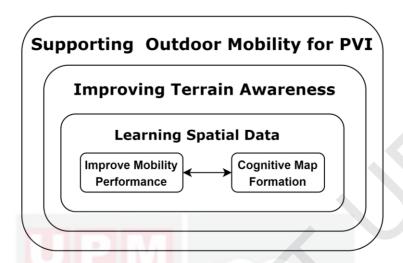


Figure 1.1: Problem Statement Points

### 1.3 Research Questions

This study aims to answer the following research questions.

- RQ 1- What factors impact the mobility of PVI regarding the presence of terrain types?
  - a. How do terrain types impact the safety of PVI?
  - b. Which specific types of terrain pose the greatest danger for PVI?
- RQ 2- What are the parameters of the mobility assistant model that improve terrain awareness and support safe outdoor mobility for PVI?
- RQ 3- How can the prototype solution be proposed to improve terrain awareness of PVI?
  - a. What design features are most effective?
  - b. Which feedback mechanism, haptic or auditory, is most appropriate?
  - c. What spatial information is necessary for good performance?
- RQ 4- To what extent does the proposed model contribute to improving terrain awareness and supporting safe mobility for PVI?
  - a. How can the model improve mobility performance?
  - b. How can the model improve cognitive map formation?
  - c. What is the prototype's effectiveness and usability level from the users' point of view?

### 1.4 Research Objectives

This study aims to support outdoor mobility for PVI by improving their terrain awareness. This aim can be achieved by identifying and evaluating a terrain awareness mobility model.

Objective 1- To identify the factors that impact PVI mobility due to the presence of various terrain types. The factors include behaviors, challenges, requirements, and features of the solution, which is able to improve PVI terrain awareness.

This objective focuses on the terrain types and the factors that make them significant challenges that impact mobility for PVI. These factors include the behaviors of PVI to tackle terrain types, the main terrain types that form the significant problems, and the requirements and solutions that can improve terrain awareness. In contrast, many research works investigated mobility for PVI and discarded the terrain challenges.

Objective 2- To propose a mobility model that provides sufficient safety spatial information and enables individuals to visualize the environment regarding the terrain types, which improves terrain awareness and supports outdoor mobility for PVI.

Achieving the first objective should provide us with the essential features of the solution that can address terrain challenges. Consequently, objective 2 deciphers the properties of the solution into a theoretical model that resolves the issues found, for example, the delivered spatial information and the appropriate feedback mechanism.

Objective 3- To design and implement a terrain awareness mobility model prototype.

The prototype should implement the theoretical features of the model achieved in objective two into a practical mobile application. Researchers agreed that collecting spatial information about more elements enables individuals to visualize the environment, generate more spatial relations, and facilitate cognitive map formation (Kitchin & Blades, 2002; Pissaloux, Velazquez, Hersh, et al., 2017). This app should use an effective real-time detection algorithm to detect four types of terrain in front of the user and convey their names, directions (i.e., up or down), and distance to reach within five meters as speech message feedback. Thus, the app will provide sufficient spatial information about various terrain types, which enables the user to visualize the area by linking these terrain types together and with the other environmental elements.

Objective 4- To evaluate the effectiveness of the proposed terrain awareness mobility model via testing the prototype.

An experimental study with participants with VI should be conducted to evaluate the proposed model. The experiment will evaluate the improvement of the terrain awareness of the users via testing the improvement of mobility performance and facilitating

cognitive map formation. Moreover, a questionnaire will be used to test the effectiveness and usability of the app from the users' perspective.

### 1.5 Research Scope

Alterations in the ground surface, precisely the existence of diverse terrain types, constitute a tangible risk that impacts PVI's physical safety, independence, and effective navigation. These threats may influence the target group's employment opportunities, health and well-being, and social involvement.

Furthermore, the revolution of deep learning methodologies and their demonstrated efficacy in real-time detection has inspired researchers to leverage this technology for aiding individuals with VI, mitigating the impact of disability on their daily activities.

TAM2 was developed to improve the terrain awareness for PVI. It was designed for adult individuals with vision impairment at levels B1 and B2. It covers outdoor mobility in terms of the challenges associated with four types of terrain found in the pedestrian zone. The investigated terrain types include potholes, drains, and ascending and descending stairs.

The recruitment of participants for the data gathering phase was carried out in collaboration with the Malaysian Associations for Blind (MAB) in KL and Ipoh. The participants who evaluated the prototype belong to the MAB-KL. The sample size is considered small compared to other studies involving participants without disabilities, where this size is sufficient for people with disabilities. To guarantee the safety of the participants, the observation and evaluation sessions were conducted in controlled areas with low traffic and pedestrians.

### 1.6 Research Contributions

This study contributes to the knowledge of the following aspects,

The first contribution is the Terrain Awareness Mobility Model (TAM2). This computer-based model improves the terrain awareness of PVI. It explains individuals' navigation behaviors when particular types of terrain are present and before the individual physically contacts it. The TAM2 clarifies the process of interaction with that terrain and tackling it. Finally, TAM2 portrays individuals learning from that experience and improving the cognitive map of that environment. Details in Chapter 5.

The second contribution is a complication of PVI mobility behaviors and requirements. This list is based on the findings of the studies conducted with experts and participants from the PVI community. Government organizations and researchers can utilize these requirements to conduct further research aimed at improving mobility for PVI. Details in Chapter 4.

The third contribution of this study is the Terrain Detection Model (TDM). This model deployed deep learning techniques using the YOLOv4 algorithm. TDM trained the image dataset for the four investigated types of terrain, which involved potholes, drains, ascending stairs, and descending stairs. The model's detection accuracy, as measured by mean average precision (mAP), is 99.11, and the inference time ranges from 160 to 250 milliseconds. Details in Chapter 6.

The fourth contribution is the Terrain Detection App (TDA). Even though this App is adapted from an existing Android detection App available on GitHub (Shakeel, 2020), significant modifications were implemented to enhance its functionality. The study integrated the TDM into the Android App. Then, to achieve the study objective, new functions were programmed from scratch. For instance, the distance calculation, preparing feedback and conveying feedback functions. The app can be utilized by PVI to improve their terrain awareness. Details in Chapter 6.

The fifth contribution of this research is the terrain images dataset, which comprises 3,189 images. The dataset includes 796 pothole images, 787 drain images, 803 ascending stairs, and 803 descending stairs. This dataset was collected from two sources, including 1,780 images from open-source websites like Google and Bing. In contrast, 1,409 images were self-captured from seven different locations in the UPM campus and its surrounding areas. Details in Chapter 6.

The sixth contribution of this research is the empirical evaluation of the effectiveness of the proposed terrain awareness mobility model in improving mobility performance and facilitating cognitive map formation. The evaluation results are also presented. The evaluation process applied in this study, based on the mobility behavioral activities related to mobility performance, is a novel contribution to the existing knowledge. Details in Chapter 7.

The seventh contribution to this study involves a map drawing technique using a magnetic whiteboard and magnetic figures representing landmarks. Although magnetic figures and whiteboards have been utilized previously, they used animal shapes to indicate animal sounds that direct individuals to a particular location. In contrast, the figures we used in this study represent real environmental landmarks with representative shapes and sizes. Therefore, the experts from the National Council for the Blind, Malaysia (NCBM) and MAB have recommended using this map drawing technique to teach blind children about spatial information. Details in Chapter 7.

The last contribution to this study is the questionnaire aimed at assessing the effectiveness of the TDA. This questionnaire underwent validation through seven experts with relevant knowledge in the HCI field and working experience with PVI. The questionnaire achieved an acceptable context validity index and demonstrated adequate internal reliability. The questionnaire results provided evidence supporting the effectiveness of TAM2 in improving the terrain awareness of PVI. Details in Chapter 7.

### 1.7 Thesis Organization

This thesis comprises eight chapters.

Chapter 2 Literature Review. The chapter begins by outlining the background of people with vision impairment and outdoor mobility for PVI. It then proceeds to identify the concepts of spatial learning and terrain awareness. The chapter delves into the literature on mobility models for PVI and reviews the latest research developments in this domain.

Chapter 3 Methodology. The chapter outlines the research methodology we applied in this study. It describes the mixed-method design employed, including the qualitative method conducted to gather data and the quantitative techniques utilized to evaluate the proposed solution. The chapter explains the various research phases, starting from the literature review, studies with experts and participants with VI, the terrain awareness mobility model (TAM2) development, prototyping, and the evaluation phase.

Chapter 4 Experts and People with Vision Impairment Studies. This chapter discusses the instruments, analysis, and results of the data collection studies conducted with experts and PVI. The chapter elaborates on the employment of the instruments, which facilitated the collection of data on the outdoor mobility challenges facing PVI, particularly regarding terrain awareness. In addition to the target group's requirements and expectations to overcome these challenges.

Chapter 5 Terrain Awareness Mobility Model (TAM2). This chapter introduces the proposed TAM2 model as the primary contribution of this study. The chapter explains the three components of TAM2: the User Model, the Terrain Detection Model (TDM), and the Learning Model. This chapter elaborated on each of these components and their corresponding sub-components.

Chapter 6 TAM2 Prototyping. This chapter details the implementation process of TAM2. The implementation is divided into three main phases. Firstly, it involves developing the TDM by employing deep learning techniques using a convolutional neural network via the YOLOv4 algorithm. Secondly, it involves the development of an Android Terrain Detection App (TDA). Finally, the TDM was combined with the TDA, tested, and debugged the system.

Chapter 7 Results and Discussion. This chapter highlights the evaluation experiment of the TAM2 effectiveness through the prototype app. The chapter describes the participants, sites, and experiment procedure involved in the evaluation process. The chapter then presents the quantitative results of the study, which demonstrate the effectiveness of TAM2 in improving the terrain awareness of PVI. The results revealed the improvement in mobility performance and cognitive map formation, in addition to the effectiveness and usability of the TDA.

Chapter 8 Conclusion and Future Works. This chapter marks the close of this research study. The chapter revisits the research objectives and outlines the research limitations. The chapter also provides recommendations for future works based on the findings and limitations.



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