COMPUTER SCIENCE DEPARTMENT

ANDRÉ TOMÁS RIBEIRO

Bachelor in Computer Science

PROCEDURAL GENERATION OF INTERIORS IN VIRTUAL REALITY(VR)

EXPLORING NEW NAVIGATION PARADIGMS

MASTER IN COMPUTER SCIENCE SPECIALIZATION IN SPECIALIZATION NAME

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ABSTRACT

Regardless of the language in which the dissertation is written, usually there are at least two abstracts: one abstract in the same language as the main text, and another abstract in some other language.

The abstracts' order varies with the school. If your school has specific regulations concerning the abstracts' order, the NOVAthesis LATEX (novothesis) (LATEX) template will respect them. Otherwise, the default rule in the novothesis template is to have in first place the abstract in the same language as main text, and then the abstract in the other language. For example, if the dissertation is written in Portuguese, the abstracts' order will be first Portuguese and then English, followed by the main text in Portuguese. If the dissertation is written in English, the abstracts' order will be first English and then Portuguese, followed by the main text in English. However, this order can be customized by adding one of the following to the file 5_packages.tex.

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Concerning its contents, the abstracts should not exceed one page and may answer the following questions (it is essential to adapt to the usual practices of your scientific area):

- 1. What is the problem?
- 2. Why is this problem interesting/challenging?
- 3. What is the proposed approach/solution/contribution?
- 4. What results (implications/consequences) from the solution?

Keywords: One keyword, Another keyword, Yet another keyword, One keyword more, The last keyword

Resumo

Independentemente da língua em que a dissertação está escrita, geralmente esta contém pelo menos dois resumos: um resumo na mesma língua do texto principal e outro resumo numa outra língua.

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Por exemplo, para um documento escrito em Alemão com resumos em Alemão, Inglês e Italiano (por esta ordem), pode usar-se:

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\ntsetup{abstractorder={de={de,en,it}}}}
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Relativamente ao seu conteúdo, os resumos não devem ultrapassar uma página e frequentemente tentam responder às seguintes questões (é imprescindível a adaptação às práticas habituais da sua área científica):

- 1. Qual é o problema?
- 2. Porque é que é um problema interessante/desafiante?
- 3. Qual é a proposta de abordagem/solução?
- 4. Quais são as consequências/resultados da solução proposta?

Palavras-chave: Primeira palavra-chave, Outra palavra-chave, Mais uma palavra-chave, A última palavra-chave

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ACRONYMS

novathesis NOVAthesis IATEX (pp. i, ii)

UX User Experience (p. 1)

VE Virtual Environment (pp. 1, 3–7)

VR Virtual Reality (pp. iv, 1, 3–7)

Introduction

[TODO: To be reworked with proper citations]

The implementation and exploration of safe, expansive and immersive Virtual Environments (VEs) has evolved with the development of VR and its wide range of navigation techniques. These techniques influence several dimensions of User Experience (UX), such as efficiency, usability, immersion, comfort, and accessibility, and are, therefore, used in different contexts and situations.

In small physical spaces, the most commonly used navigation techniques rely on joystick-based movement and teleportation, due to the physical contraints of the environment. By cutting the use of Natural Walking, these techniques prove to be less immersive and unrealistic, as they trade the realism of walking elements for ease-of-use.

To address these limitations, new navigation paradigms have been developed. Some of these resource to the use of Impossible Spaces and Non-Euclidean Geometry to provide users the ability to naturally walk through extensive VEs, even whithin restricted physical spaces. By manipulating spatial perception and geometry, these techniques create the illusion of larger virtual spaces, enabling more intuitive and immersive navigation experiences.

It's through User Testing that the distinct advantages and disadavantage of each of these techniques are evaluated, making it easier to pinpoint which paradigms fit best into different contexts or situations.

1.1 Motivation

1.2 Related Questions

Q1-Is it worthwhile to explore navigation through non-Stride techniques whilst in a constricted physical space?

Q2-Does using hyperbolic strides instead of linear ones lead to increased disorientation and cybersickness?

Q3-Do hyperbolic spaces effectively convey more control to the user compared to spaces with linear strides?

RELATED WORK

With the objective of understanding the current state of the art in the field of Virtual Reality (VR) navigation and locomotion, this chapter presents several topics, techniques and studies that are relevant to this field.

[TODO: Add 'Background' section, introducing HMDs, VEs and give proper definitions on Navigation, Wayfinding and Motion][7]

2.1 VR Locomotion Techniques

Locomotion (also denoted as "active travel" or just "travel"[10]), the act of moving from one place to another, is often considered one of the most fulcral aspects of VR interaction[13], as it permits navigation in Virtual Environments (VEs)[2].

Throughout the advancements in VR research and technology, multiple locomotion techniques have been developed, all with different characteristics, addressing different needs and use cases[3]. It's due to the diversity of these techniques that various typonomies and classifications have been proposed, throughout the years of VR development [3]. [TODO: ADD MORE REFS] The structure of this subsection is based on the typology of VR Locomotion Techniques proposed by Boletsis et al. [3] as it emcompesses most techniques according to the characteristics discussed in this section.

According with Boletsis et al.[3] locomotion techniques are distinguished by the type of interaction they require, the type of motion it produces and the type of VE it is designed for, as seen in Figure 2.1.

Regarding the interaction type, a locomotion technique can be "physical" - the input is based on the user's physical movement - or "artificial" - utilizes input devices for direct VR motion and navigation. VR motion types may be "continuous" - the transitions between positions is smooth and non-interrupting - or "non-continuous" - the transitions between positions are abrupt or instantaneous. Finally, the VR interaction space may be "open" - the VE is larger the the user's physical space - or "limited" - the physical environment constraints the VE's size.

Different sets of these characteristics define the different types of locomotion techniques

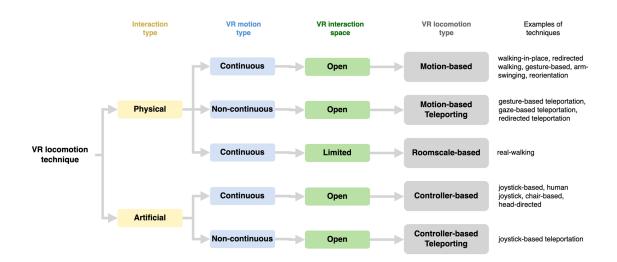


Figure 2.1: Typology of VR locomotion techniques by Boletsis et al.[3]

that are to be discussed in the following sections. It is also important to note that these techniques may be used in combination with each other, i.e., a technique integrating two or more other techniques[3].

2.1.1 Controller-Based

Controller-Based locomotion techniques are used in an open VR interaction space, with continuous motion and require an artificial means of input, such as a controller or other similar input devices[1]. Joystick-based locomotion is not only the most prevalent of this type of techniques, it is also one of the most used techniques in research. [3]

Joystick-Based locomotion can be described in the following manner: given a user in a VE from a VR application, the way that they navigate in said VE is dependent on a joystick controller. The joystick rests in a neutral position until the user applies force, changing its value in a certain axis, normally from -1 to 1 (see Figure 2.2). The values registered on the joystick's horizontal and vertical axis will make the user continuously translate from one position to the next in the direction related to the user's gaze direction, i.e., if the user is looking in a certain direction and applies vertical of 1 they will move in the yaw direction of their gaze at full speed. [6]

The artificial means of creating input for movement makes joystick locomotion consiedered not physically demanding and a high ease-of-use technique, especially noticed in users who have prior experience with similar controllers.[12] This locomotion type also registers moderate-to-high levels of immersion when used, mostly due with the motion's uninterruptive nature.[2]

Though intuitive and not physically demanding, joystick locomotion has a caveat that pretains to the user's comfort. This locomotion type can create motion sickness, due to the conflicting movement cues from user's proprioception, their vestibular sense and from

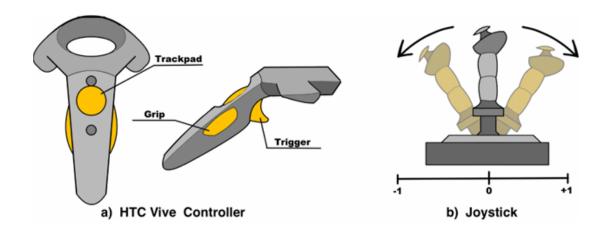


Figure 2.2: Diagram of Vive Controller and Joystick [6]

their vision, as the user is physically stationary whilst they move in the VE[10]. This is especially felt by unexpericienced VR users. [12]

[TODO: Address that this discomfort makes this type of technique not the most indicated for this thesis]

[TODO: Find papers on human-joystick, chair-based and head-directed]

2.1.2 Controller-Based Teleporting

Controller-Based Teleporting differs from Controller-Based locomotion techniques in that it is non-continuous, as, instead of moving continuously, users are interrumptly teleported from one location to another next during their navigation [1], and much like joystick-based locomotion it is one of the most used locomotion types[3].

When teleporting a user dictates where they want to teleport to, usually by holding down some input button on a controller and pointing to the pretained destination with the controller, releasing said input when the destination has been chosen. On release the user moves to the selected destination instantaneously (see Figure 2.2).[6][12]

The uncontinuouty of this locomotion methods' creates strengths and weaknesses. On the positive side, the discrete jumps prevent feelings of cybersickness by not having a conflicting continuous motion occurring while the user is stationary [12] [2], and is generally more efficient at percurring long distances[6]. On the other hand the jumps can create some disorientation and loss of immersion, as after teleporting the user taks more time to fully comprehend their surroundings [10], exerting more cognitive effort and in turn breaking the ilusion of the VE.

Even so, in various comparison studies, teleportation has been identified as a prefered locomotion technique[10][2].

[TODO: Add more to the last statement, exploring why that preference occurs and if it is correspondent to efficiency]

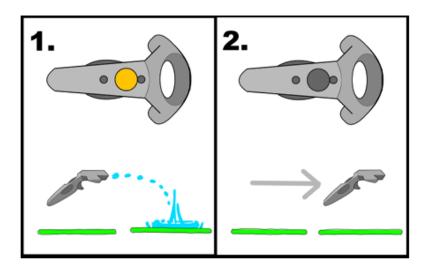


Figure 2.3: Graphical Representation of Teleporting [6]

[TODO: Finish by addressing that the lack of immersion makes this type of locomotion a no go for the thesis]

2.1.3 Motion-Based

As a type of locomotion techniques that require physical interaction for continuous motion in open VR interaction spaces, Motion-Based techniques are based on the user's physical movement for their navigation in VEs[1]. Therefore most of the locomotion techniques under this umbrella are conditioned by the user simply walking, also referred as Natural Walking [TODO: NEED CITATION].

With the addition of human senses, Natural Walking is a much more intuitive mode of locomotion in a VE and heavily prefered by users[3]. It has also shown to be a most compentent technique regarding the user's ability to aquire spatial knowledge[10].

[TODO: Talk about the difference of Natural Walking against artificial input locomotion types][13]

[TODO: Talk about (the need for) Redirected Walking][13][5][17][14]

[TODO: Present papers on Motion-Based Non-Natural Walking methods][6]

[TODO: Address that due to the high levels of ease-of-use and immersion, this is the indicated type of locomotion for addressing the problem of maitaining high immersion levels in VR whilst there are contraints in physical space due to Natural Walking]

2.1.4 Motion-Based Teleporting

Similarly to the difference between Controller-Based and Controller-Based Teleporting, Motion-Based Teleporting techniques differ from Motion-Based techniques in that they are non-continuous, as users are teleported from one location to another during their navigation, instead of moving continuously[1].

[TODO:Find papers on motion-based teleporting techniques] [4]

2.1.5 Room-Scale Based

Room-Scale Based locomotion techniques are unique in the fact that, even if they're physical and continuous motion types of techniques, they function in a closed VR interaction space, meaning that the VE is limited by the user's physical space[3].

[TODO: Find papers on room-scale based techniques]

2.2 Non-Euclidean Space in VR

[TODO: Add an introduction to the topic. Explain Euclidean vs Non-Euclidean.] [15] [20] [9] [8] [11] [16] [19] [18]

[TODO: Shorten this and add relations with other articles [7]. Much of the core concepts here (Cognitive Maps, Wayfinding etc.) might be addressed in the soon to be Background section]

In 2019, Warren conducted an experimental biology paper on Non-Euclidean Navigation[20], with the purpose of defying the assumptions of how humans and animals navigate. Traditionally, according to the Cognitive Map Hypothesis, humans rely on Euclidean cognivitive maps, essencially a mental map, for orientation and navigation. Warren, though, pruposes a new hypothesis instead: humans navigate according to Cognitive Graphs, stating that spatial knowledge is instead described as a labeled graph with nodes that link places and paths, each with their own local metric data for distances.

To test his theory he conducted a VR experiment in which two groups of users had to traverse a maze, yet one group travesed the maze normally whilst the other traversed a maze with the inclusion of invisible wormholes that seemlessly transported them from one position to another creating a Non-Euclidean Impossible space, as seen in Figure 2.4.

After being firstly tasked to explore the mazes and find four of the objects present in the maze and not the route they took between them (Bookcase to Cactus and Well to Sink), the groups were then prompted to go from object 'A' to an object 'B' without the mazes structures and relying on their spatial knowledge alone. The results shown in Figure 2.5 and the paths from the first task on Figure 2.4 reveal that the participants in the Non-Euclidean maze were biased by the use of wormholes, revealing that despite the irregularities created by the presence of wormholes, participants were able to reach their targets even with the geometric discrepancies created by the wormholes, and that local metric cues and graph-like navigation strategies were enough to guide users to the pertained destination.

Further proving his hypothesis, Warren demonstrates how Non-Euclidean spaces are primed for use in VR Navigation that provide advantages for Natural Walking VR applications, as seen in the following sections.

2.2.1 Impossible Spaces

[TODO: Present various papers on Impossible Spaces]

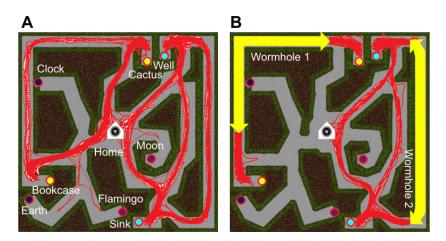


Figure 2.4: Traversed mazes in Warrens' study. Red lines indicate the paths users took. A is the Euclidean maze, B is the Non-Euclidean maze [20]

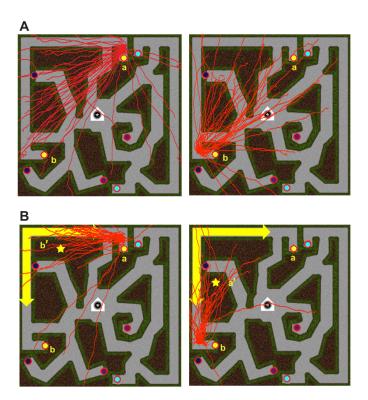


Figure 2.5: Paths taken between objects Bookcase and Cactus in Euclidean maze A and Non-Euclidean maze B. Stars in maze B indicate the location of the object in Euclidean coordinates [20]

2.2.2 Hyperbolic Spaces

[TODO: Present various papers on hyperbolic Spaces]

2.3 Space Modification Techniques

[TODO: Add proper introduction. This section is for common techniques used to create the spaces referred before]

2.3.1 Procedural Content Generation

[TODO: Introduce the basics of PCG and how to use it for VEs]

2.3.2 Spatial Compression

[TODO: Present papers on Spatial Compression]

Plan and Analysis

Conclusion

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