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Study of Various Computer Vision Algorithms for Registration in Augmented Reality: A Survey

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Abstract: *Augmented reality is defined as the fusion of virtual object in real world. Registration is basic step for creating an immersive AR experience to the user. The registration algorithms helps in placing the virtually created object in the most accurate position in the real world. This paper shows an in-depth comparative analysis of various registration algorithm under computer vision that are used for AR applications. The comparative analysis helps in identifying the strengths, weaknesses and the applicability of each algorithm in various AR fields by studying different case studies and real-world applications which helps in showing the practical implication of these algorithms. Also, the challenges associated with AR are discussed and future scope of this aims at advancement of the registration algorithms so as to make the AR experience more functionable and smooth. This survey paper can help researchers, developers who have interest in knowing or exploring the field of computer vision algorithms for solving the registration problem in Augmented Reality.*

Keywords: *Augmented Reality, Computer vision, Vision-based, Algorithms, Registration*

I. INTRODUCTION

Augmented Reality (AR) has become a trendy IT topic in last few years. Augmented Reality is a concept of interaction of human with a mix of real and virtual world. Augmented Reality does help in enhancing the real world by overlaying the virtual or digital information on it[1][2]. It can be said that Augmented Reality is real world enhanced with virtual computer generated information in real-time[3]. Augmented Reality helps enriching the environment in real time by introducing immersive sensations[4]. The phrase “real-time” differentiates Augmented reality from Virtual Reality. Virtual Reality (VR) can be defined as the virtual simulated 3D environment that feels like real to the user and gives user the feel of being there at the moment[5]. Talking about Augmented Reality, in day to day life it is being used in education sector, for learning purposes, in E-commerce, in architecture, in retail and many other industries[4]. Augmented Reality is used for viewing virtual anatomy while performing a surgery[3]. It is also used for training deep neural networks[1].

Augmented Reality helps in enhancing the awareness of the situation in hazardous outdoor conditions, it provides help with navigation in urban settings. As previously talked, about the use of AR in architecture, it can be used by virtually prototyping the architectural layout and interior design of the structure that is to be constructed[2]. The research in Augmented Reality is mainly focused on tracking and registration[6]. Registration algorithms helps in overlaying the virtual objects onto the real world and helps in making the overall experience smooth and more real to the user[7].

This paper comprises of the following: Section 1.1 talks about the key role of registration in Augmented Reality. Section 2.0 comprises of comparative analysis of different indoor registration algorithms on factors like accuracy, robustness, versatility and real time applications of these algorithms. Section 3.0 gives brief about the application of these algorithms in Augmented Reality based devices. Section 4.0 discusses about the challenges and future scope in this field. Section 5.0 shows the paper conclusion.

A. Pivotal Role of Registration in Augmented Reality

The implementation of overlaying a virtual object on to the real world is done via registration, so we can say that registration play a pivot role in placement and alignment of virtually crafted object on to the real world. Registration helps in aligning the image or virtual object with the real world[8]. It is crucial maintaining and keep track of position of virtual object with respect to the real world[8]. Registration is an important step in accuracy-chain for an AR system. The registration process allows for detection of collision, comparison of variance and distance measurement in an AR based architecture planning[9].

For Augmented Reality tracking the registration methods used are broadly divided into two types[10]:

1) *Indoor Registration*

- Simultaneous Localization and Mapping (SLAM): It is a featureless vision registration algorithm. The goal of the SLAM procedure is to map an unknown area while also using the sensor's data to locate a sensor system within it[11]. It can be divided into different types like Visual SLAM and RGB-D Slam, LIDAR SLAM.
- Vision Based: This involves the alignment of virtual information with real world in indoor settings. It can be implemented using markers or marker less (using features)[12]. It comprises of algorithm such as SIFT, SURF, AKAZE, PTAM. These algorithms are feature based algorithms used for registration purposes.

2) *Outdoor Registration*

- Vision Based: This involves aligning virtual information with real world in outdoors. This can be implemented via LIDAR integration, Feature-based methods, Global positioning system integration[13].
- Inertia Based: This is done by using information from the inertial sensors like gyroscope, accelerometer, so as to align virtual object with the real world. Some approaches of Inertia based registration are Inertial Measurement Unit (IMU), Visual-Inertial Odometry (VIO), sensor fusion techniques[14].
- GPS Based: This type of registration is done using leveraging Global Positioning System (GPS) data for the alignment of the virtual object with the real-world. Some approaches for GPS- based registration are GPS positioning, GPS-aided Vision-Based Registration, Differential GPS[15].

These are the types of computer vision algorithms that are used in registration of virtual object in Augmented Reality. The overall precision of AR application while registration basically depends on the tracking method it is using.

In the concept of computer vision, registration is referred as the alignment of various data sets, that can be images or 3-dimensional models.

II. COMPUTER VISION ALGORITHMS FOR AUGMENTED REALITY

The computer vision algorithms that are to be discussed in this paper are given below:

- 1) SIFT (Scale- Invariant Feature Transform): This algorithm is feature based registration algorithm that come under the category of
- 2) SURF (Speeded-up Robust Features)
- 3) ORB (Oriented FAST and Rotated BRIEF)
- 4) AKAZE (Accelerated KAZE)
- 5) BRISK (Binary Robust Independent Elementary Features)
- 6) NFT (Natural Feature Tracking)
- 7) PTAM (Parallel Tracking and Mapping)

III. COMPARATIVE ANALYSIS

The objective of this paper is to compare and analyze different computer vision algorithms used for registration in Augmented Reality. Various algorithms such as SIFT (Scale-Invariant Feature Transform)[16], SURF (Speeded-Up Robust Features)[8], ORB (Oriented FAST and Rotated BRIEF)[17], AKAZE (Accelerated-KAZE)[18], BRISK (Binary Robust Independent Elementary Features)[19], NFT (Natural Feature Tracking)[20], PTAM (Parallel Tracking and Mapping)[21] are some of the robust vision-based registration algorithms of computer vision used in Augmented Reality[22]. In this paper the above-mentioned registration algorithms are compared on the basis of different parameters like accuracy, robustness, applicability to real-time systems, handling occlusions.

Table 1: Comparative analysis of various registration algorithms

Algorithm	Accuracy	Robustness	Handling Occlusions	Use Cases
Scale-Invariant Feature Transform (SIFT)[16]	Moderate	Robust to alterations	Limited	Image matching, object recognition
Speeded-Up Robust Features (SURF)	Moderate to high	Robust to alterations	Limited	Image matching, object recognition
Oriented FAST and	Moderate to	Robust to	Moderate	Real-time tracking and

Rotated BRIEF (ORB)	High	alterations		SLAM
Accelerated KAZE (AKAZE)	Moderate to High	Robust to alterations	Good	Image matching, object recognition
Binary Robust Independent Elementary Features (BRISK)	Moderate to High	Robust to alterations	Good	Real-time tracking and image matching
Natural Feature Tracking (NFT)	Moderate to High	Sensitive to lightning	Good	Markerless AR, object tracking
Parallel Tracking and Mapping (PTAM)	High	Robust to rapid motion	Good	Real-time 3D reconstruction and Augmented Reality

The above-mentioned table shows some of the vision-based algorithms that are used for registration. The factors on which they are compared are defined as followed:

- 1) Accuracy: It is the ability of the algorithm to give the result as close to the desired output.
- 2) Robustness: Ability of the algorithm to handle the changes in the input data.
- 3) Use Cases: Where the specified algorithm can be used for performing suitable task.
- 4) Handling Occlusions: Describes the ability of the algorithm to manage the situations where features are either partially or completely obscured.

The selection of algorithm varies according to the need of user, for more accurate construction of 3D models PTAM algorithm can be chosen, while if the priority is real-time performance, then ORB can be selected.

IV. APPLICATIONS

In Augmented Reality, computer vision algorithms play crucial role for precise registration of the virtually created object onto the real world. Some of the real-world applications of this are mentioned below:

- 1) Virtual prototyping in interior designing and architecture[2].
- 2) The use of digitally elevated maps and predicting visual clues for registration[2][23].
- 3) Used in process of aligning medical images[24].
- 4) The use of computer vision algorithms for imager recognition and real-time tracking using different device components in games such as Pokémon Go. This help in creating and immersive gaming experience for the user[4].
- 5) Used in retail shopping for example in IKEA, a place where a buyer can visualize the furniture before buying in their home. Computer vision algorithms help in accurate registration of virtually created furniture.
- 6) Development of hardware neural network for distributed robot control[25].
- 7) To deliver accuracy of camera pose in AR applications[26].
- 8) Used in profession race car events for showing race information[21].
- 9) Used in games like Pokémon Go, this app uses device’s camera, gyroscope, clock and GPS for performing outdoor registration[27].

These are some of the applications of augmented reality that are done using different registration algorithms.

V. CONCLUSION

The comparison analysis of various vision-based computer vision algorithm for registration was done. It was concluded that algorithms vary in their accuracy and robustness, depending on the input provided to them. How an algorithm responds to different type of occlusion was also compared, as it is important to know about the working of algorithm in such situations. The use cases of these algorithms were also discussed.

An overall understanding of the algorithm and their characteristics, along with their thorough testing can help in implementation of various application in real world. Therefore, the selection of algorithm for registration depends on the requirements of the user. If an algorithm is considered good for its one application, it might not be best for fulfilling some different condition.

VI. CHALLENGES AND FUTURE SCOPE

In Augmented Reality there are many challenges like users have privacy concerns, understandability of users need and design it according to the need of user[4]. There are many challenges that come into light while analyzing various registration algorithms of computer vision in Augmented Reality. In Robust registration of 2D or 3D point set analysis main challenge is the unknown correspondence between point sets and dependence on initial estimate[28]. Other challenge in robust algorithms is that it becomes difficult for them to analyze when lighting condition changes which leads to inaccuracy. On the other hand some of the algorithms require high processing power, which makes the real-time execution of them quite challenging.

The survey of various registration techniques helped in identifying efficiency and working of these algorithms. In the future more work in different fields can be done like exploring the use of deep learning and neural networks in further advancement of registration algorithms in Augmented Reality. Exploring different applications of these registration algorithms in real-world scenarios. Discussing about the scalability of these registration algorithms and find how these algorithms perform in various scenarios. More work can be done on various factors such as the system response, the stability of algorithm and factors influencing the use of AR algorithms.

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