

# A Survey on Current Techniques of Real Time Multiple Object Tracking from Video based on Background Subtraction Algorithm

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*Abstract*— In PC vision, the most dynamic exploration points are visual reconnaissance in element scenes, particularly for people & vehicles. Wide range of promising applications incorporating human identification at some distance, controlling access in extraordinary ranges, measurements of group flux and investigating blockage or odd particles and for the utilization of numerous cameras intelligent reconnaissance and so much more. Visual observations in element scenes in the handling system incorporates various taking after stages i.e. characterization of moving item, depiction of the comprehensive particles, identifying the movement, displaying the whole situation, proof of human identification, at the end combining the information from different cameras. There are mixes of 2D & 3D images, therefore recognizing abnormalities and conducting forecast so that substance based recovery of reconnaissance features can be done. There are more things to understand about these like, common dialect portrayal, data combination from various sensors.

**Key words:** Object Tracking, SLAM, DATMO, Bayesian Framework

## I. INTRODUCTION

Object tracking is a technique that is being used from past centuries. This technique includes an application called surveillance that helps to detect the threats on public places that may be the crowded public place or a mall or public transport with the help of CCTV cameras. In the object tracking process the object is considered to be in motion if its location is changing with respect to its background. By using background subtraction method the change of frame is detected, in case there is no difference between two frames the object is considered to be static. Our work is to propose a system that detects the motion and to compare its results with the performance with former systems.

Now day's vision based techniques area unit used for tracking several objects. But it's still a difficult task for a few reasons like occlusion or incomplete foreground extraction. It's thus essential to adopt few probabilistic models with some learning method to discover and track the item. During this, a way is introduced to trace multiple objects mistreatment each the background modeling and particle filter.

Particle filter has one among a way for tracking objects mistreatment color. Several researchers have used the particle filter for several object tracking. Pan et al. proposed the best particle allocation in mistreatment particle filter to trace several objects. Kenji et al. used the particle filter for tracking of various players in hockey match. Since the particle filter is to estimate the posterior density of state variables provided observation variables, the performance of filter may be degenerated relying upon importance sampling method. To avoid this issue, specializing in the item of interest is important. Some techniques area unit devised to

the present finish and that they embrace background modeling to extract foreground or mistreatment colour data to target involved object. A number of illustrious techniques of background modelling include the Gaussian average, kernel density estimation, Gaussian mixture model. Particle filter uses color data for tracking objects.

Tracking is a number of set targets in closed-circuit with same colour could be a difficult task. During this way is projected to trace several objects mistreatment particle filter and background subtraction. The proposed methodo minimizes the quality of drawback by proscribing the generation of particles. That is, spreading of particles is controlled by specializing in the item. The methodology used completely different colored particles to trace multiple objects. Straight forward background subtraction methodology is employed to extract foreground.

Multi-target tracking could be a currently classical, however troublesome task in laptop vision. Following some targets whereas robustly maintain the information association remains for the most part open downside. This is often attributable to many aspects. A main problem is that complexness of state one must deal with: the quantity of potential target trajectories over time is extremely massive, and there's a mechanical phenomenon for every of a separate variety of targets. By itself a huge state house needn't be a tangle; however several physical constraints introduce dependencies each between totally different locations of a similar target and between different targets. As an example, every object's linear and angular speed should be physically plausible, and also the distance between any two objects cannot become every which way little. Since the separate trajectories aren't freelance of every alternative, maximizing their joint posterior is normally NP-complete.

To compound that, inter-object occlusions cause look changes and missing proof. To resolve the object interactions, many approaches are planned that aim to incorporate them within the model and notice a joint answer, as critical chase every target singly. This is often typically achieved by proscribing the state house to a finite set of candidate locations, either by threshold the observation chance or by frequently discrediting the situation position. The discrimination, at side of sure simplifications of physical constraints, yields energy functions that world minimum are often found. Though this property is actually engaging, the worth to operate that solely roughly approximates the underlying posterior. Here, we have a tendency to raise the question whether or not it's extremely judicious to seek out the world optimum of associate degree inaccurate energy, or whether or not it's going to be additional acceptable to construct associate degree energy that reliably represents the particular downside, despite the fact that now not bell-shaped.

There is a tendency to propose energy operate over all target locations and every one frames of a time window, that covers several necessary aspects of multi-target

situations. To attenuate the ensuing energy, we have a tendency to devise an area improvement In Proc. theme that is in a position to explore several probably attention-grabbing regions of the search house while not obtaining at bay within the initial basin of attraction. Our approach goes on the far side the progressive in many ways in which.

- The targets' locations aren't guaranteed to separate object detections or grid positions, that means that every target's position continues to be outlined just in case of detector failure, which there's no grid aliasing;
- There is no ought to by artificial means limit the energy operate. The object dynamics, look models, and even additional concerned extensions like cluster behavior are often integrated into the energy. whereas we have a tendency to cannot guarantee world optimality, our experiments counsel that the chase downside will have enough structure that for cheap energy functions one will avoid weak native minima and notice plausible modes of the posterior;
- The custom-tailored minimization procedure is powerful, however efficient: it's capable of fixing the spatiality, thereby exploring a far larger portion of the search house than commonplace gradient strategies, however all the same stays centered on the promising regions and avoids random search behavior.
- The problem of tracking multiple non-stationary positions, i.e. together estimate the quantity of targets and individual states, directly from the video information during not the requirement for detection. Most of the multi-target tracking approaches for video information include detection operation to take the purpose measurements before multi-target filtering is applied. This popular multi-target tracking algorithm that doesn't need color-based visual trailing, detection embodies woody plant, multi-modal distribution, theorem existence method. In theory, the detection incurs data loss which may considerably degrade trailing performance, particularly in the low signal to noise magnitude relation. Tracking process directly from the video information is of elementary interest because it ignores this kind of knowledge loss. A later approach to the multi-target trailing that has been attracted substantial interest is that the random finite set of framework. This is impelled by elementary thought in the estimation theory or estimation error.

This approach displays the set of target states, called as multi-target state, as a finite set. RFS multi-target filtering techniques such as particle chance hypothesis density and mathematician mixture filters which are applied to tracking from the video information via detection. RFS-based techniques are used for tracking various targets directly from the video information that has been investigated with success incontestable on tracking of sport players.

## II. LITERATURE REVIEW

Asma Azim and Olivier Aycard(2007) , In this paper The reliable perception of the surrounding environment is a very important step for an intelligent vehicle. It is usually divided into two subtasks: simultaneous localization and mapping (SLAM) and detection and tracking of moving objects

(DATMO). The purpose of SLAM is to provide the vehicle with a map consisting of static entities of the environment while DATMO uses that map to detect and track dynamic entities. We have presented an approach capable of performing detection, classification and tracking of moving objects from 3D range data. Experimental results have shown that our system can successfully perform the moving object tracking from a vehicle in different dynamic outdoor scenarios. The proposed approach uses an octree based occupancy grid map- ping of the environment in 3D .

Weiming Hu, Tieniu Tan, Liang Wang, and Steve Maybank(2012), in this paper author compare the Visual surveillance in dynamic scenes, especially for humans and vehicles, is currently one of the most active research topics in computer vision. It has a wide spectrum of promising applications, including access control in special areas, human identification at a distance, crowd flux statistics and congestion analysis, detection of anomalous behaviors, and interactive surveillance using multiple cameras etc. In general the processing framework of visual surveillance in dynamic scenes includes the following stages: modeling of environments, detection of motion, classification of moving objects, tracking, understanding and description of behaviors, human identification, and fusion of data from multiple cameras. Visual surveillance in dynamic scenes is an active and important research area, strongly driven by many potential and promising applications, such as access control in special areas, person-specific identification in certain scenes, crowd flux statistics and congestion analysis, and anomaly detection and alarming, etc .

Philip Lenz, Julius Ziegler, Andreas Geiger and Martin Roser(2010), in this paper modern driver assistance systems such as collision avoidance or intersection assistance need reliable information on the current environment. Extracting such information from camera-based systems is a complex and challenging task for inner city traffic scenarios. This paper presents an approach for object detection utilizing sparse scene flow. For consecutive stereo images taken from a moving vehicle, corresponding interest points are extracted. We presented a novel approach for class-independent object detection for inner-city traffic scenarios. The proposed algorithm uses computationally efficient sparse interest points in consecutive stereo images to compute the scene flow.

Boris Kluge Christian Kohler Erwin Prasslerin (2012) this paper we focus on the task of tracking multiple moving objects in rapidly changing, dynamic environments. Objects are extracted from laser range finder images and correspondences between successive images are established by network optimization techniques. The approach is implemented on a robotic wheelchair, used in two applications and evaluated experimentally. In this paper we presented an object tracking system based on a laser range finder as its sensor and on graph algorithms for data processing. The basic idea is to represent the motion of object shapes in successive scan images as flows in bipartite graphs. By optimization (maximum flow, minimum cost, maximum weighted matching) we get plausible assignments of objects from successive scans. In our experiments the system proved to perform considerably more robust than its predecessor [PS98] which is based on a greedy nearest neighbor search among the objects' cen-

ters of gravity. However the presented system still has to be improved for real long-term tracking as shown in the discussion.

Andreas Ess, Konrad Schindler, Bastian Leibe, Luc Van Gool(2008), in this paper, we address the problem of vision-based navigation in busy inner-city locations, using a stereo rig mounted on a mobile platform. In this scenario semantic information becomes important: rather than modeling moving objects as arbitrary obstacles, they should be categorized and tracked in order to predict their future behavior. To this end, we combine classical geometric world mapping with object category detection and tracking. Object-category specific detectors serve to find instances of the most important object classes (in our case pedestrians and cars). Based on these detections, multi-object tracking recovers the objects' trajectories, thereby making it possible to predict their future locations, and to employ dynamic path planning. The approach is evaluated on challenging, realistic video sequences recorded at busy inner-city locations.

M. Hedayati, Wan Mimi Diyana Wan Zaki (2009) Data validation is also used which will eliminate the pixels that are not connected to the image under consideration. There are also the light changes in the background which means that there can be another image feature that could give rise for having a luminous background. When two images are coming closer to each other the background subtracted frame shows it as one. This is known as occlusion. In a no. Of objects if a frame increased suddenly show the entry of new object into frame .

Ling et al. given an object tracking approach based on contours. The object rough location is found though multi-feature fusion strategy. For accurate and robust object contour tracking, they have extracted the contours with the help of region-based object contour extraction. In their model the object rough location is obtained by color histogram and Harris corner features fusion method. In the particle filter method they have used the Harris corner feature fusion method. Their model of region-based temporal differencing is applied in object contour detection step, and the resultant is the rough location tracking result.

Optical flow detection is used in automatic and fast tracking initialization algorithm. In color based contour evolution algorithm the correlations between values of neighboring pixels for posterior probability estimation is measured using Markov random field (MRF) theory and the correlations are incorporated into the estimation of the posterior probability of segmentation. Their adaptive shape-based contour evolution algorithm combines the color feature alone and the shape priors to obtain the final contour. A new incremental PCA technique is applied to update the shape model, making the shape model updating flexible. In the Markov model-based dynamical shape model, the dominant set clustering is used to obtain the typical shape modes of a periodic motion.

Rajabi and Nahvi (2013) proposed a modified contour-based multiple object tracking algorithm using point processing. This approach has the advantage of multiple objects tracking. Their system can detect and track the peoples in indoor environments videos. In their method they have used Gaussian mixture model (GMM) based background modeling for background estimation.

Tao Yang, Stan Z.Li, Quan Pan, Jing Li (2011) In this research paper dynamics scenes are used for real time multiple object tracking. The ability to cop up with a occlusion and long duration without any prior knowledge about objects motion or shape is a unique characteristic. Under different conditions of indoor and outdoor video sequences are used for performing extensive experiments. If the background keeps changing than the condition would be of complete occlusion. By using fusing multiple camera inputs we can overcome occlusion in multiple object tracking. Some approaches also used region-based background subtraction.

Vishwadeep Uttamrao Landge,(2011) In this research paper movement of any object is the most important part in detecting and tracking any object. In a video sequence the main purpose is to detect the movement of object from the background image of the video and for its tracking. This research paper establishes an updating model of reliable background using background subtraction method. Tracking an object in a video stream and detecting the motion of an moving object is studied in this paper. To analyse the position of any moving human body the centroid is computed.The results shows that this proposed method fits for real-time detection which runs quickly and accurately. The application discussed under this research paper are visual surveillance, precise analysis of athletic performance and content based video retrieval.

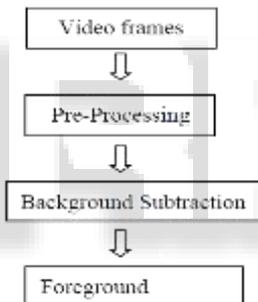


Fig. 1: General Flow Diagram for BGS System

Sri Lakshmi Gogulamudi and B M Kusuma Kumari(2014) in this research paper a new approach for detection and tracking of multiple objects in video surveillance systems using particle filter is introduced and this paper considers the previous work done i.e environmental factors as traditional information for detecting and tracking objects efficiently. In this relationship between object and environmental factors using distance transform techniques gives better tracking accuracy. While large number of effective are used which greatly minimize tracking errors.

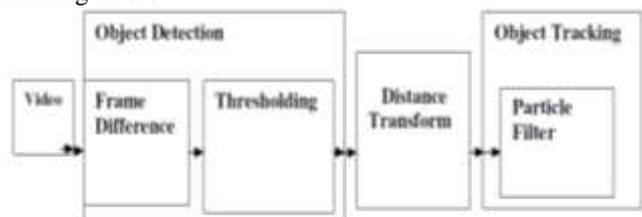


Fig. 2: Multiple object tracking using particle filter system

Barga Deori and Dalton Meitei Thounaojam(2013) In this paper the demanding research area is tracking the motion of an object in a video in the domain of computer vision and image processing. This review paper states

various tracking methods by categorizing them into different categories. Background subtraction is used for object segmentation in most of the methods. Various other methodologies are used in tracking strategies like mean-shift, particle filter, Kalman filter etc. Background information of an image is responsible for the performance of any tracking method. In this research paper tracking methods are classified into three different groups providing detailed description and their positive and negative aspects i.e. contour-based object tracking model, region-based object tracking model and featurepoint-based tracking algorithm.

Jie Shao, Zhen Jia, Zhipeng Li, Fuqiang Liu, Jianwei Zhao, Pei-Yuan Peng (2010) In this research paper not only background subtraction to detect foreground objects is used but it conducted multiple object tracking with data association and tracking filters in an open-loop procedure. In this research Gaussian mixture model is used in which each pixel is first modeled. Multiple hypothesis trackers with an adaptive interacting multiple model is used for tracking of foreground moving objects. It is mandatory to adjust Gaussian mixture model's parameters to accurately extract the pixels of foreground objects.

### III. BACKGROUND SUBTRACTION ALGORITHM

Background subtraction is a typical and generally utilized method for producing a frontal area veil by utilizing static cameras. However, identifying movement through background subtraction is not generally as simple as it may first show up. Undoubtedly, a few features with poor signal-to-noise ratio brought about by a low quality camera, pressure antiquities or a loud domain, are liable to create various false positives. False positives can likewise be impelled by brightening changes (continuous or sudden), an animated background (waves on the water, trees shaken by the wind), or camera jitter to give some examples. Then again, false negatives can likewise happen when a moving article is made of hues like the ones out of sight (the alleged camouflage effect). With such situations, a basic inter frame concession with worldwide limit uncovers itself as a frail arrangement. The objective of this study is triple:

- evaluate how better complex routines are contrasted with straightforward background subtraction systems;
- compare the handling force and the measure of memory needed by every strategy at runtime;
- determine to which sort of feature every strategy suits best.

As background subtraction is broadly utilized as a part of PC vision, various studies and similar studies have been distributed throughout the years Purpose of Background Subtraction Algorithm

- Decrease issue set for further preparing
- Segment the image into foreground and background
- Just process piece of picture that contains the applicable data

### IV. BACKGROUND SUBTRACTION TECHNIQUE

Uses a reference background image for comparison purposes. Current image (containing target object) is compared to reference image pixel by pixel. Places where

there are differences are detected and classified as moving objects.

#### A. Background Modeling:

A reference background image computed over a number of static background frames.

##### 1) Threshold Selection:

Decides proper edge qualities utilized as a part of the subtraction operation to get a craved location rate.

##### 2) Pixel Classification:

Classifies the kind of a given pixel, i.e., the pixel is the part of background (counting common foundation and shaded foundation), or it is a moving item.

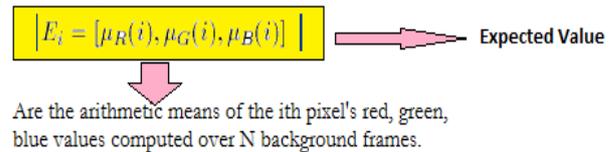


Fig. 3: Background modeling

### V. CONCLUSIONS

Exhibited a review of late advancements in visual reconnaissance for visual observation frameworks inside of a general handling structure. It includes movement division, article characterization, and ecological demonstration with respect to the recognition of moving articles. Three methods for movement division are tended to: background subtraction, fleeing differencing, and optical stream.

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