Review of Fire Detection and Localization Techniques in Video Surveillance Applications

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Abstract- Because of high fire frequency and huge damage, the early fire detection is becoming more and more important. Due to the rapid development of image processing technology, video image in the application of detection technology has become more and more widely. Video based fire detection technology is becoming the focal point of research with its advantages of high intuitive, speed and antijamming capability. This paper reviewed the fire detection methods based on video images in recent years. Through the review, it is clear to see that video based fire detection technology can be divided into two main areas: the characteristics detection of flame and smoke. This fire detection method can improve the accuracy of the fire alarm, real-time and robustness. If the optimal algorithms can be adopted for each part of detecting motion area and extracting fire characteristics, the system performance will be further improved.

Keywords—Fire, Detection, Machine Learning, CNN, Alarm, Localization.

I. INTRODUCTION

A fire finder is a sensor intended to recognize and react to the presence of a fire or fire, permitting fire detection. Reactions to an identified fire rely upon the establishment, yet can incorporate sounding an alarm, deactivating a fuel line, (for example, a propane or a flammable gas line), and actuating a fire concealment framework. At the point when utilized in applications like modern heaters, their job is to give affirmation that the heater is working appropriately; it tends to be utilized to wind down the start framework however much of the time they make no immediate move past advising the administrator or control framework. A fire indicator can regularly react quicker and more precisely than a smoke or hotness finder because of the components it uses to identify the fire.

There are many fire detection frameworks which depend on video imaging that are carried out in various exploration works, with barring some of detection which utilizes video sequencing. The fire detection research is by and large dependent on video groupings and is isolated into two after classifications: fire detection and fire smoke detection [1]. Proposed framework associated with fire detection method, consequently it is talked about in this segment. Two general classes of approach can be recognized for fire detection: 1) conventional fire alarms and 2) vision sensor helped fire

detection. Conventional fire alarm frameworks depend on sensors that require nearness for initiation, like infrared and optical sensors. These sensors are not appropriate to basic conditions and need human association to affirm a fire on account of an alarm, including a visit to the area of the fire. Besides, such frameworks can't generally give data about the size, area, and consuming level of the fire. To defeat these restrictions, various vision sensor-based strategies have been investigated by analysts in this field; these enjoy the benefits of less human impedance, quicker reaction, reasonable expense, and bigger reconnaissance inclusion. What's more, such frameworks can affirm a fire without requiring a visit to the fire's area, and can give point by point data about the fire including its area, size, degree, and so on Regardless of these benefits, there are still a few issues with these frameworks, e.g., the intricacy of the scenes under perception, unpredictable lighting, and bad quality edges; analysts have put forth a few attempts to address these perspectives, thinking about both shading and movement highlights.

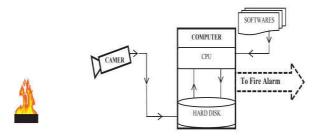


Figure 1: Fire Detection Conventional Approach

The equipment incorporates camera lens, image sensors, a focal processing unit (central processor) and a hard plate. Fire and smoke, whenever identified at an early nascent fire stage, can be effectively be constrained by firefighters making escape by others to security, not troublesome. The customary detection techniques, be that as it may, have numerous huge downsides, incorporating time defers particularly in huge spaces with high roofs (like atria, holder and stockrooms). Video fire detection frameworks can likewise be applied to identify timberland fires. What's more, to shield recorded structures from fire harm thus keep up with the authentic attributes of their building plan, some video fire detection frameworks can be joined with existing shut – circuit TV (CCTV) video reconnaissance framework.

As an outcome, utilization of a video fire detection framework can be valuable in supplementing the insurance of huge spaces, timberland and verifiable structures both constantly.

II. LITERATURE SURVEY

K. Muhammad et al.,[1] propose a unique, energyaccommodating, and computationally productive CNN design, enlivened by the SqueezeNet engineering for fire detection, localization, and semantic comprehension of the location of the fire. It utilizes more modest convolutional bits and contains no thick, completely associated layers, which helps downplay the computational necessities. Notwithstanding its low computational requirements, the exploratory outcomes show that our proposed arrangement accomplishes exactnesses that are tantamount to other, more complicated models, mostly because of its expanded profundity. Besides, this work shows how a tradeoff can be reached between fire detection precision and proficiency, by thinking about the particular qualities of the issue of interest and the assortment of fire information.

W. Thomson et al.,[2] presents diverse Convolutional Neural Network (CNN) models and their variations for the non-fleeting constant limits detection of fire pixel districts in video (or still) imagery. Two diminished intricacy smaller CNN models (NasNet-A-OnFire and ShuffleNetV2-OnFire) are proposed through exploratory examination to advance the computational effectiveness for this assignment. The outcomes enhance the present status of-the-craftsmanship answer for fire detection, accomplishing a precision of 95% for full-outline double arrangement and 97% for superpixel localisation.

K. Muhammad et al.,[3] proposed framework depends on insightful autonomous and subordinate specialists, where every specialist has an alternate errand to answer to the fire detachment and debacle the board right away. A profound yet productive CNN is used in the framework for include extraction, arrangement, localization, and detection of fire in video outlines. At the point when the fire is identified in the casings, a fire alert is in a split second shipped off the crisis office and all specialists quickly start their processing for really looking at the seriousness and development pace of the fire, perceiving the scene and all articles on fire, and clearing checking. It is accepted that utilizing such a framework is the interest of an opportunity to save humankind from enormous fire calamities and can make the current observation networks more canny.

K. M. Akhil et al.,[4] proposed localization or situating is a significant perspective in wireless sensor network (WSN). In WSN sensor hubs are by and large circulated arbitrarily and to install GPS module to every one of the hubs make the execution all the more exorbitant. However, finding the position precisely is a lot of fundamental in a portion of the cases like woodland fire detection, creature observing and

so on In this regard machine learning approach might assume a significant part. In this article a thorough writing audit is done on machine learning methods and an original machine learning based self-localization procedure is proposed.

A. Abiri et al.,[5] centers around the planning of a framework that arrangements with the expert marksman situating dependent on utilizing just projectile Shockwave signals. The first gained Shockwave signal in quite a while's exhibit isn't from the fired shot and determines just the applicable point on the slug direction. Consequently, in this exploration, by using the two least mouthpieces include clusters in the 2-Dimensional genuine climate, first it is gotten the slug direction, and afterward in a drive, the decrease bend of the Mach number on this shot direction, is dedicated to finding the wellspring of the fire. Likewise, the summed up cross-connection stage change strategy is utilized for computing of the time delays between the amplifiers in an exhibit.

J. Zhu et al.,[6] proposed and its adequacy is confirmed by tests. The use of sub-pixel detection strategy in aligning sound system vision framework can fundamentally work on the exactness and strength of fire situating. Nonetheless, with the increment of fire distance, the situating blunder would increment altogether, which is unavoidable. The trial results show that the increment of the pattern distance can viably stifle the expansion of the situating blunder under the benchmark distances of 186mm, 249mm and 438mm. Along these lines, after a proper benchmark distance is coordinated, the variable gauge distance sound system vision framework dependent on sub-pixel detection can be utilized for fire situating of more extensive territory.

G. S. C.A et al.,[7] presents distinctive Convolutional Neural Network (CNN) structures and their variations for non-fleeting double fire detection and localization in video or still imagery. We think about the presentation of tentatively characterized, diminished intricacy profound CNN structures for this undertaking and assess the impacts of various enhancement and standardization strategies applied to various CNN designs (crossing the Origin, ResNet and EfficientNet engineering ideas). In opposition to contemporary patterns in the field, our work delineates a most extreme by and large precision of 0.96 for full edge double fire detection and 0.94 for superpixel localization utilizing a tentatively characterized diminished CNN design dependent on the idea of InceptionV4.

M. Aktas et al.,[8] gives MIL loosens up the necessity of having precise areas of fire patches in video outlines, which are required for fix level CNN preparing. All things being equal, just casing level marks showing the presence of fire some place in a video outline are required, significantly lightening the explanation and preparing endeavors. The subsequent methodology is tried on another fire dataset got

by expanding a portion of the recently utilized fire datasets with video arrangements gathered from the web. Exploratory outcomes show that the proposed technique further develops fire detection execution upto 2.5%, while giving patch level localization without requiring patch level explanations.

X. Fan et al., [9] presents the reproduction results that the guide limit set up by the Hammer calculation is self-evident, and the territory climate is all around replicated, and the situating of the robot is figured it out. The fire source recognizable proof calculation precisely distinguishes the region and forms of the fire, and understands the astute detection of the fire source point. Moreover, the combination of the two calculations empowers the firebattling robot to freely recognize the fire source in the indoor climate, adequately forestalling the event of fire mishaps.

G. Laneve et al.,[10] The limits identified with the affectability of the geostationary sensor to fire sizes have been, essentially partially, defeat by presenting explicit calculations. Notwithstanding, the diminished exactness in the geographic localization of the fire, which can, on a basic level, possess any situation in a space of around 16 km 2 (at Mediterranean scopes), makes this data not extremely fascinating for the organizations associated with firefighting. This work investigates the attainability of working on the localization of the warm peculiarities (areas of interest) by consolidating images obtained simultaneously from various MSG satellites situated at various longitudes. Specifically, we consolidate the images obtained by MSG-9 situated at long. 9.0°, MSG-10 situated at 0.0° and MSG-8 situated at long. 41.5°.v.



Figure 2: Sample of fire image

K. Muhammad et al.,[11] propose a unique, energyaccommodating, and computationally effective CNN engineering, roused by the SqueezeNet design for fire detection, localization, and semantic comprehension of the location of the fire. It utilizes more modest convolutional parts and contains no thick, completely associated layers, which helps downplay the computational necessities. In spite of its low computational necessities, the test results exhibit that our proposed arrangement accomplishes exactnesses that are practically identical to other, more intricate models, fundamentally because of its expanded profundity.

S. S. Esfahlani et al.,[12] presents a framework that consolidates mechanical working framework (ROS) and PC vision procedures for fire detection in a blended reality climate. We have gathered video transfers from a little camera on an Automated Flying Vehicle (UAV), where the route information depended on best in class Simultaneous Localization and Mapping (Hammer) framework. The information gathered locally available are conveyed to the ground station and handled through the automated working framework. A vigorous and proficient re-localisation Hammer was performed to recuperate from following disappointment and edge lost in the got information. The fire detection calculation was created dependent on the shading, development ascribes, transient variety of fire force and its amassing around a point.

III. CHALLENGES

False alarms- False alarms wrong establishment, lost connections, defective or maturing equipment, and ill-advised maintenance are the most well-known problems we run over in checking business and private fire alarm frameworks. As the observing organization, we don't have the advantage of coming nearby to review equipment and ensure everything is working effectively.

Equipment & Connection Problems- Individual smoke alarm affectability change, float remuneration, and maintenance-required markers are an only not many of the latest tech propels assisting with further developing fire detection equipment. Tragically, electronic gadgets likewise age, which could make equipment breakdown similarly because of time. Another issue could be that the equipment was never introduced accurately from the beginning, which could prompt a large group of problems not too far off. Quite a few things could likewise break the connection between the alarm framework and the observing station, which is the reason we suggest introducing somewhere around one reinforcement connection in each checking situation.

Maintenance- The most ideal way of ensuring an alarm framework stays ready to rock 'n roll is with tests, assessments, and ordinary maintenance. We suggest assessing business frameworks yearly and private frameworks no not exactly every a few years. Normal maintenance will assist with recognizing problems before they cause issues and keep your clients' frameworks. The issues inside a clinic are not as old as are in a stockroom. In an office where life wellbeing is the significant concern, for example, medical clinics where patients will be unable to empty all alone, early admonition is fundamental. Dorms, inns, and different offices where tenants might be dozing when a fire begins likewise necessitate that a framework give more fast notice.

In a distribution center, where the inhabitants will be conscious and mindful and there will regularly be less of them, the alarm system frequently doesn't have to give notice as ahead of schedule. In a for the most part abandoned design where life security is certifiably not a significant issue, detection of a fire can be slower without altogether expanding hazard. While choosing a framework, we should consider the continuous responsibility that will be needed over the existence of the framework. Investigation, testing, and maintenance necessities for these frameworks are broad. Meeting these prerequisites over the existence of a framework typically will cost more than the first establishment.

IV. CONCLUSION

The Location determination is an important problem for almost all WSN applications. However, obviously becomes an important target in the case of surveillance systems for fires do not have to support real-time monitoring of each point of an area at any time location early threat of fire. Solutions applying wireless sensor networks, on the other hand, can gather sensorial data values, like temperature and humidity, from all points of a area incessantly, day and night, and allow for fresh and precise data to the firefighting center rapidly. This paper presents the review of fire detection and localization techniques in video surveillance applications.

REFERENCE

- K. Muhammad, J. Ahmad, Z. Lv, P. Bellavista, P. Yang and S. W. Baik, "Efficient Deep CNN-Based Fire Detection and Localization in Video Surveillance Applications," in IEEE Transactions on Systems, Man, and Cybernetics: Systems, vol. 49, no. 7, pp. 1419-1434, July 2019, doi: 10.1109/TSMC.2018.2830099.
- W. Thomson, N. Bhowmik and T. P. Breckon, "Efficient and Compact Convolutional Neural Network Architectures for Non-temporal Real-time Fire Detection," 2020 19th IEEE International Conference on Machine Learning and Applications (ICMLA), 2020, pp. 136-141, doi: 10.1109/ICMLA51294.2020.00030.
- K. Muhammad, J. J. P. C. Rodrigues, S. Kozlov, F. Piccialli and V. H. C. d. Albuquerque, "Energy-

Efficient Monitoring of Fire Scenes for Intelligent Networks," in IEEE Network, vol. 34, no. 3, pp. 108-115, May/June 2020, doi: 10.1109/MNET.011.1900257.

- K. M. Akhil and S. Sinha, "Self-Localization in Large Scale Wireless Sensor Network Using Machine Learning," 2020 International Conference on Emerging Trends in Information Technology and Engineering (ic-ETITE), 2020, pp. 1-5, doi: 10.1109/ic-ETITE47903.2020.339.
- A. Abiri and A. Pourmohammad, "The Bullet Shockwave-Based Real-Time Sniper Sound Source Localization," in IEEE Sensors Journal, vol. 20, no. 13, pp. 7253-7264, 1 July1, 2020, doi: 10.1109/JSEN.2020.2978814.
- J. Zhu, W. Li and L. Da, "A Variable Baseline Distance Stereo Vision System for Fire Localization Based on Sub-pixel Detection," 2019 9th International Conference on Fire Science and Fire Protection Engineering (ICFSFPE), 2019, pp. 1-9, doi: 10.1109/ICFSFPE48751.2019.9055769.
- G. S. C.A., N. Bhowmik and T. P. Breckon, "Experimental Exploration of Compact Convolutional Neural Network Architectures for Non-Temporal Real-Time Fire Detection," 2019 18th IEEE International Conference On Machine Learning And Applications (ICMLA), 2019, pp. 653-658, doi: 10.1109/ICMLA.2019.00119.
- M. Aktas, A. Bayramcavus and T. Akgun, "Multiple Instance Learning for CNN Based Fire Detection and Localization," 2019 16th IEEE International Conference on Advanced Video and Signal Based Surveillance (AVSS), 2019, pp. 1-8, doi: 10.1109/AVSS.2019.8909842.
- X. Fan et al., "A Fire Protection Robot System Based on SLAM Localization and Fire Source Identification," 2019 IEEE 9th International Conference on Electronics Information and Emergency Communication (ICEIEC), 2019, pp. 555-560, doi: 10.1109/ICEIEC.2019.8784563.
- G. Laneve, G. Santilli and R. Luciani, "Improving SEVIRI-Based Hotspots Detection by Using Multiple Simultaneous Observations," in IEEE Journal of Selected Topics in Applied Earth Observations and Remote Sensing, vol. 12, no. 7, pp. 2349-2356, July 2019, doi: 10.1109/JSTARS.2019.2898126.
- K. Muhammad, J. Ahmad, Z. Lv, P. Bellavista, P. Yang and S. W. Baik, "Efficient Deep CNN-Based Fire Detection and Localization in Video

Surveillance Applications," in IEEE Transactions on Systems, Man, and Cybernetics: Systems, vol. 49, no. 7, pp. 1419-1434, July 2019, doi: 10.1109/TSMC.2018.2830099.

S. S. Esfahlani, S. Cirstea, A. Sanaei and M. Cirstea, "Fire detection of Unmanned Aerial Vehicle in a Mixed Reality-based System," IECON 2018 - 44th Annual Conference of the IEEE Industrial Electronics Society, 2018, pp. 2757-2762, doi: 10.1109/IECON.2018.8592764.