Approach to Detecting Forest Fire by Image Processing Captured from IP Cameras

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ABSTRACT

In this paper, the results show an algorithm to detect the presence of smoke and flame using image sequences captured by Internet Protocol (IP) cameras is represented. The important characteristics of smoke such as color, motion and growth properties are employed to detect fire. For the efficient smoke and fire detection in the captured images by the IP camera, a detection algorithm must operate directly in the Discrete Cosine Transform (DCT) domain to reduce computational weigh, avoiding a complete decoding process required for algorithms that operate in spatial domain. In order to assess the possibility and the accuracy of proposed algorithm, the author used the video sequences which are captured by IP camera from control forest fire at different spatial location and levels of fire intensity. Evaluation results illustrated the efficiency of the proposed algorithm in effectively detecting forest fires with accuracy at 97%.

Keywords: Forest fire; Smoke and Fire Detection; DCT; IP Camera; Images Processing

1 Introduction

Forest fire is a complex physiological process which includes numerous direct and indirect impacts on the atmosphere, biosphere and hydrosphere. That is one of the key drivers of major changes in term of air pollution in many parts of the world. Forest fires often occur on a large scale especially in complex mountainous terrain, intricate to access. Therefore, forest fire detection by traditional approaches is inappropriate.

In recently years, Vietnam annually has 650 forest fires which are damaged average 4.340 ha of forest. In which, it has about 3.200 ha plantation forest and approximately 1.140 ha of natural forest. In 2002, forest fires in U Minh Thuong and U Minh Ha destroyed 5.500 ha of Melaleuca forest, including 60% of primary forest. In early 2010, forest fires in Hoang Lien - Lao Cai National Park destroyed more than 700 ha of forest. The deprivations caused by forest fires in term of economic, social and environmental are quite enormous and difficult to calculate.

Early detection of forest fires can help to alarm and prevent disasters, resulting in major human and property damage. The combustion of objects usually begins with the emission of smoke, even before igniting. Therefore, smoke is an essential element for early fires detection. The smoke characteristics depend on the chemical properties, temperature, oxygen content, etc. The color of the smoke ranges from white to white-blue when fired at low temperatures and from gray to black when the temperature rises to ignition. The most general smoke detectors are based on infrared or ultraviolet cameras. In addition, other detection techniques are based on particle analysis, temperature, relative humidity, and air transpiration. These systems will operate when smoke or fire particles are close to

fire detection devices and unable to provide information regarding the exact location, intensity, spread, etc. [1] To provide more accurate and reliable smoke detection, some video-based detection systems have been proposed. The algorithm for detecting fire through video is based on two main characteristics of fire: flame and smoke. Most fire detection algorithms in the theory use some of the characteristics of fire and smoke, such as fire / smoke color, flaking, changing of fire area boundary.

Recently, the use of IP cameras with video surveillance has grown significantly, due to the simple IPbased monitoring system at low cost. Therefore, the use of cable systems and wireless Internet infrastructure has been widely applied [3]. Furthermore, an IP camera not only captures sequences of images but also has its own processor, memory and operating system, allowing programs to process information obtained without additional computer equipment. IP cameras can be connected to form networks that make a video surveillance system more reliable. Data is the information provided by encrypted IP cameras in many format: Motion-JPEG (MJPEG), H.264, or so on... [3].

This paper focuses on image processing techniques based on the use of smoke detection algorithms from IP camera. Proposed algorithms operate directly in the DCT domain and can be implemented on IP camera surveillance systems. This algorithm has used a number of smoke features including color, motion and spread characteristics that extracted directly from the DCT coefficient during decoding.

2 Materials and Methodology

2.1 Forest fire detection algorithm for IP camera

2.1.1 IP camera – image receiver

The use of IP technology for forest fire detection give a countless advantage, for example IP-camera networks can detect fire origin magnitude and propagation in more accurate manner compared with a single video surveillance system. However, to efficiently use the IP technology for fire detection purposes, the smoke detection algorithm must perform directly in the Discrete Cosine Transform (DCT) domain, because decoding (from DCT domain to spatial domain) and possible encoding (from spatial domain to DCT domain) are considerably high time consuming processes. Moreover, almost all fire detection algorithms including those proposed in [2, 5, 6] are carried out in the spatial domain, analyzing the value of each pixel or block of pixels. Therefore, any implementation of these algorithms in IP technology requires considerably high extra processing time.

Generally, an IP camera captured sequences of images, the number of frame captured depend on each different camera, normally it can reach over 20 frames per second. In addition, has its own processor, memory and operating system, allowing loaded programs to process the captured information without the need of additional computer equipment and the information provided by IP camera is encoded data in JPEG or MJPEG format.

Additionally, the quality of images captured by IP camera is stable without disturbance by signal transmission process. For normal cameras which are set up in less interfering environment and the signal is transmitted by coaxial cable to the receiver, signal still affected by material of it's cable. Therefore, the quality of images cannot be remaining for analysis process to detect objects, particularly forest fires.

2.1.2 Image processing to detect forest fires

Normally, IP camera uses two basic protocols to access the images that captured from the sensor via internet: *http* protocol (HyperText Transfer Protocol) and *rtsp* protocol (Real Time Streaming

Protocol). These protocols allow access data from IP camera in two different formats: (1) *http* protocol allows assess and download directly JPEG images; (2) *rtsp* protocol uses H.264 codec, thus the received signal need a decoder to covert it ino JPEG images. Each protocol is used depending on different IP camera. Captured images by IP camera would be sort by time and then put in image processor to detect smoke or flame or event both of these signals (see fig. i).



Figure 1. Block diagram of the proposed smoke detection scheme (Leonardo et al, 2012)

Captured images from IP camera usually have relatively high resolution and the minimum resolution is 1280 x 720 px. If these images are processed directly, the processes are highly time consuming operations but high accuracy. By contrast, if these images are zoom out, the processing time requires less but low accuracy. To detect forest fire, it is not requiring high speed but need high accuracy, thus the captured images will be remaining quality for processing.

In this paper, the author not establish a new algorithm for image processing, they use the combination of many algorithms that are applying in detecting forest fire in the world [2, 4]. Including:

The image that captured by camera is divided into blocks of 8 x 8 pixels of each frame. After that, the DCT inter-transformation is applied to all DCT blocks of 8 × 8 coefficients of each frame to get DCT blocks of 4 × 4 coefficients. Using the DC values of each DCT block of the 4 × 4 coefficients of several consecutive frames, motion and color properties of smoke are analyzed to get the smoke region candidates. Each DCT block can define 3 channels including Y, Cb and Cr. In which, to identify the motion of DTC blocks, the author use channel Y, and to classify the characteristics color of smoke and flame use channel Cb and Cr.

- *Motion detection*: Consider the DC coefficients of block DCT block of $S_b \times S_b$ ($S_b = 8$), this coefficient is the value to analyze the characteristics of motion of a block. S_b times the average value of the block in spatial domain which is given by:

$$C(0,0) = \sqrt{\frac{2}{S_b}} \alpha(0) \sum_{q=0}^{S_b-1} \left(\sqrt{\frac{2}{S_b}} \alpha(0) \sum_{q=0}^{S_b-1} B(p,q) \cos\left(\frac{(2p+1)\times 0\times \pi}{2S_b}\right) \right) \cos\left(\frac{(2p+1)\times 0\times \pi}{2S_b}\right)$$
(1)

$$= S_b \times \left(\frac{1}{S_b^2} \sum_{q=0}^{S_b-1} \sum_{p=0}^{S_b-1} B(p,q)\right)$$
(2)

In which, $Y_t(x, y)$ is the DC coefficient value of a block at location (x, y) in frame t. Each DCT block is classified into motion or statistic block as equation below:

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$$f_m\left(Y_{t-1}^{DC}(x,y), Y_t^{DC}(x,y)\right) = \begin{cases} 1 \text{ if } th_1 < \frac{1}{s_b} \left|Y_{t-1}^{DC}(x,y) - Y_t^{DC}(x,y)\right| < th_2 \\ otherwise \end{cases}$$
(3)

Considering that f_m is a binary matrix of size M × N (M is width, N is the height of captured image). And th1 and th2 are two threshold values are experimentally determined as 12 and 80 respectively which considering the general motion speed presented by smoke

-Smoke color analysis: color is another integral feature of smoke that have been used commonly in several smoke detection algorithms. Almost al algorithms used RGB and YcbCr (Y: Luminance; Cb: Chrominance-Blue; and Cr: Chrominance-Red) color space-based rules to determine smoke color.

+ These rules are given by equation:

Rule 1:
$$R \pm \alpha = G \pm \alpha = B \pm \alpha$$
 (4)

Rule 2:
$$80 \le (R + G + B) / 3 \le 220$$
 (5)

Where $15 \le \alpha \le 20$

- The pixel is considered as smoke if these adapted as follows:

Rule 1:
$$(C_b - 128)^2 + (C_r - 128)^2 \le \alpha^2$$
 (6)

$$Rule 2: Th_3 \le Y \le Th_4 \tag{7}$$

Where C_b , C_r , Y are the DC values of two Chrominance and Luminance of (x,y) block, applying the linear transform between RGB and YCbCr, it follows that $\alpha = 10$, *Th3* = 80 and *Th4* = 220. Thus, if both rules are satisfied, DCT block is considered as smoke by color property, that is $f_c = (Y, C_b, C_r) = 1$, otherwise $f_c = (Y, C_b, C_r) = 0$.

Therefore, both feature analyses are conducted, the blocks that satisfy both smoke features are considered as smoke candidate region, as follows:

$$B_{t} = f_{m} \wedge f_{c} \wedge f_{l}.$$
(8)

- Region analysis

After detecting smoke candidate, it necessary to eliminate some objects possess similar properties to smoke. The connection of several connection blocks is used and each candidate region is denoted by A_k , k = 1, 2, 3, ... K. where k means the label number. Considering that smoke has a property of continuously expansion, the corresponding of two adjacent smoke regions presents an expansion overlapping. To analyze this smoke property, each region is updated using Equation:

$$A_t^k = \begin{cases} A_{t-1}^k \cup A_t^k , \text{ neu } A_{t-1}^k \cap A_t^k \neq \emptyset \\ A_t^k , \text{ otherwise} \end{cases} \quad k = 1, 2, \dots, K$$
(9)

In consequence, a new image includes motion region and is labeled can be considered as smoke region. On the other hand, if captured images are not satisfied with all the rules above, it is not considered a smoke region.

2.1.3 System architecture (Ground monitoring station)

An overview of the ground monitoring system is illustrated in fig. ii. The system is designed as a unified block that automatically captures images around the station.



Figure 2. The block scheme of fire watch system

This system has 2 independent cameras which are rotated in a circle. All these motions are programmed to cover the area surveillance automatically by mean of repetitive sweeps. In a rotation, each camera provides 36 images evenly.



Figure 3 The diagram of the system's function

2.2 The image-based fire detection software



Figure 4. Block diagram of proposed fire detection software

At the same location, camera captured a number of images in different time which are processing and comparing with each other by detection algorithms to give a final result. The coordinate of fires is determined by the two integrated camera. These coordinate are overlaid with forest map, road map and hydrograph map to classify it belong to forest area or not. If the fire occurs in forest area, a fire-alarming is given immediately through email and SMS.





Figure 5. The forest fire detection system architecture

2.3 2.4. System operation

Each monitoring system include 01 IP camera connected to the Internet to transmit to the server by 3G signal. These data are captured images which after a predetermined period of time are retrieved automatically by software from serve for analyzing process. In the case of many stations connected to sever, this software will set up the time for assess to station in a fixed cycle that all images could be collected. There more stations connected to server the more operation in the system and the cycle is more complicated.

Each captured images will be analyzed to detect smoke and flame by some smoke or fire detecting algorithms (fig vi). When a fire is detected, system will will identify the exact it's location and give an alarm. The coordinate of a fire can be determined by coordinated of 2 monitoring stations and 2 observation angles from camera in these stations. By overlaying fire's coordinates on forest map, software will define exactly where fire occur in forest or non forest. When detected an abnormality (flame, smoke) the system will give a message to phone, email or website to warning users automatically. The manager can access and chose appropriate solutions.



Figure 6. Captured images from camera to determined fire

Time for analyzing an image is about 0.3 second. Time for loading an image from station depends on the connection speed of 3G network. However, the image resolution is low (280 x 720 Pixel- up space of about 140 Kb), loading image is not taking too long time. Hence, a camera will load about 1440 images approximate 197 Mb in a day. These images are stored in hardware and will be delete after period of time depend on the space of hardware.

2.4 2.5. Materials

The performance of smoke, flame detection and the accuracy of proposed algorithm is evaluated by using different sample video sequences and conducted some "control burnings".

TT	Content	Quality			
1	The vertical background is crowded with vehicles,	- Video size: 320 x 240 pixel			
	near camera has a large branch of tree that	- Frame speed: 9fps			
	affected by strong winds.	- Time: 00:11:02			
2	View from the hill to around in sunny condition,	- Video size: 352 x 288 pixel			
	faint image, effected by insect, weak wind.	- Frame speed: 25fps			
		- Time: 00:04:01			
3	The frame of a fire in sunny conditions, the location	- Video size: 720 x 576 pixel			
	of fire coincides with horizon, slow fire speed, weak	- Frame speed: 7fps			
	wind.	- Time: 00:02:01			
4	The frame of smoke is produced by a factory in	- Video size: 720 x 576 pixel			
	residential area which is crowded with vehicles and	- Frame speed: 10fps			
	people, weak wind.	- Time: 00:01:00			
5	A frame contains a "control burning" in closely	- Video size: 320 x 240 pixel			
	distance, people walked around the fire.	- Frame speed: 15fps			
		- Time: 00:00:47			
6	A frame contains a forest fire in closely distance,	- Video size: 400 x 256 pixel			
	the image of the fire covered the frame.	- Frame speed: 15fps			
		- Time: 00:00:13			

Table 1. The description some of video sequences used in evaluation of the proposed algorithm



a. U Minh Thuong National Park b. Soc Son – Ha Noi c. Ba Vi National Park Figure 7: The test image of control burning to evaluate the smoke and fire detection capabilities of proposed algorithm

3 Results and discussions

3.1 Testing proposed algorithm with video

The results of testing some video sequences indicates the performance of the proposed algorithm in detecting smoke and fire.

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	Video 1		Video 2		Video		Video 4		Video 5		Video 6	
No	Detected	No detec ted	Detec ted	No detec ted								
1	532	3	180	0	49	0	24	0	130	0	154	0
2	337	6	210	1	65	1	38	0	112	0	128	0
3	465	22	191	0	51	0	39	0	168	0	153	0
4	531	7	208	1	39	1	35	1	132	0	154	0
5	531	6	177	0	35	0	32	1	149	0	130	0
6	531	7	147	0	32	1	21	0	151	0	151	0
7	401	25	206	0	21	0	21	0	162	1	154	0
8	332	36	226	1	21	0	21	0	145	0	154	0
9	216	6	238	1	23	0	23	0	122	0	154	0
10	314	8	220	0	29	0	29	1	156	1	154	0
Ave.	419	12.6	200.3	0.2	36.5	0.82	28.3	1.06	142.7	0.2	148.6	0

Table 2 The results of evaluating the accuracy of proposed algorithm in video sequences

Table 2 shows that there is only video 01 have got a false alarm (3%), and the number of video remaining perform the rate of detecting that approach to 100 % in term of accuracy. There are some reasons that affect on false alarm in video 01. Firstly, in the video many vehicles are running in the road. The second reason is near the camera has a large branch of tree that affected by winds. In contrast, the remaining video, the objects are in static state and clearly background. This indicates that apply proposed algorithm in detecting smoke and fire is effectiveness.

3.2 Testing proposed algorithm with reality fire

The yield of proposed algorithm is calculated based on "control burning" in some areas. Fig 07 and 08 show the video sequences in evaluate performance of detecting smoke and fire algorithm, Fig (a1, a2, a3, a4 and b1, b2, b3, b4) are the frame of fire and Fig (c1, c2, c3, c4) are images after processed.

- Smoke detection results









c1



Control burning in Development Centre of Forestry in Ha Noi (Soc Son)



Control burning in U Minh Thuong National Park



a4

b4 c4 Control burning in U Minh Thuong National Park

Figure 8. Smoke detection performance; (ai, bi) Frame sequences; (ci) image after processing

- Fire detection results (night time)



Figure 9. Fire detection performance; (a, b) video sequences; (b) image after processing.

Performance results on video sequences show that there are to cases including detected or nondetected. In the second case, smoke or fire cannot be detected because of many different reasons such as the color of background and smoke/fire is the same, and the observation distance from camera effect on the accuracy (fig viii – a4, b4, c4).

4 Conclusions

The Discrete Cosine Transform (DCT) algorithm of each 8×8 block is the input for smoke processing and fire detection.

The characteristics of smoke, fire, motion, color and expansion are analyzed directly in the DCT domain to minimize the time and increase the accuracy of the results.

The DCT algorithm used video sequences and control burning, the results show the accuracy of detection up to 97%. The main cause of false detection is the similarity of color between background and smoke, the distance of the camera to the fire location.

The JPEG format processing algorithm from IP Camera can be applied efficiently in early detection of forest fires in Vietnam.

Application software for early detection of forest fires from the ground observation station is designed and developed based on the requirements of forest resource management and minimization of forest fire damage in areas where fire occurs frequently in Vietnam.

The software is integrated with ground observation stations, regular monitoring stations and fire monitoring by IP cameras. The monitoring stations are compact and stable designed with low cost and efficient for forest fire monitoring tasks in Vietnam.

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