# **An Algorithm for Detection of Forged Images**

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Abstract—Digital image forgery is the manipulation of digital images which has become easy due to powerful computers, advanced photo-editing softwares and high resolution capturing devices. Tampered images bring difficulty for people to prove the trustworthiness of digital images. The authenticity of digital images is very important. There are many techniques of forging a digital image, and to detect these forgeries, researchers have come up with many methods and algorithms. These methods have their own advantages and disadvantages. In this paper, we compare different passive digital image forgery detection techniques based on the tampering operations. We also present a forensic algorithm to not only detect but also localize image forgery through analysis of nonaligned double JPEG artifacts. The objective of this paper is to identify the research gaps in passive digital image forgery detection techniques and to show how localization of image forgery is done using JPEG compression properties.

# 1. INTRODUCTION

The rapid growth of image processing softwares and the advancement in digital cameras has given rise to large amounts of tampered images with no obvious signs, leading to a great demand for automatic forgery detection algorithms in order to determine the authenticity of a candidate image. The authenticity of photographs has an essential role as these photos are popularly used as supporting evidences and historical records in growing number and wide range of applications from forensic investigation, journalistic photography, criminal investigation, law enforcement, insurance claims and medical imaging [2]. Any image manipulation can become a forgery, based upon the context in which it is used. Detecting forgery in the digital images is one of the challenges of this exciting digital age. A lot of research is underway to detect and prevent forgery in digital images[3].

Image forgery detection techniques can be either active or passive. The passive detection techniques can be based on tampering operations such as copy move, splicing, resampling, image processing operations or jpeg compression properties.

Since most of the cameras these days are exporting JPEG file format, several methodologies have been designed to detect the artifacts introduced by JPEG recompression. Such artifacts can be categorized into two classes, according to whether the second JPEG compression uses a DCT grid aligned with the first compression or not. The first case will be referred to as aligned double JPEG (ADJPG) compression, whereas the second case will be referred to as non-aligned double JPEG (NA-DJPG) compression [12].

In this paper, we compare the different passive techniques for digital image forgery detection based on tampering operations on the basis of various parameters and identify the limitations of the algorithms. As per our knowledge, there is no comparison done of the passive image forgery detection techniques based on tampering operations and this motivated us to compare the passive forgery detection techniques. We also present an algorithm which not only detects but also localizes tampering in a forged image using non-aligned double JPEG artifacts.

This paper is organised as follows: Section 2 presents the comparison of different passive digital image forgery detection techniques based on tampering operations. In section 3, an algorithm for detecting and localizing forgery by analyzing the non-aligned double JPEG artifacts is provided. Finally, conclusion and future work are given in Section 4 and acknowledgement is given in section 5.

## 2. COMPARISON OF DIFFERENT PASSIVE DIGITAL IMAGE FORGERY DETECTION TECHNIQUES BASED ON TAMPERING OPERATIONS

We have compared various passive image forgery detection techniques based on the tampering operations such as copy move, image splicing or image composites, resampling, image processing operations, and JPEG compression properties. This comparison has been made based on the criteria such as frequency of occurrence, complexity, role of tampering in image forgery detection, how and why is this tampering carried out, how is its detection carried out. Based on our analysis, the shortcomings or drawbacks of the given approaches are identified from the papers and expressed here. Our work given in Table 1 can help the researchers in identifying new research areas to work on.

#### 3. AN ALGORITHM FOR DETECTING AND LOCALIZING FORGERY

In this paper we present the algorithm to discriminate between original and forged regions in JPEG images. This algorithm is based on the hypothesis that the tampered image presents a double JPEG compression, either aligned or non-aligned. Previous approaches needed to manually select the suspected region for the presence of double compression artifacts. But this algorithm, which is based on Bayesian approach, automatically computes a likelihood map indicating the probability for each DCT block of being doubly compressed. We are focusing on detection of non-aligned double JPEG compression. In order to correctly interpret the image as forged or not in the presence or absence of artifacts due to double compression, we analyse the different scenarios [12].

In the first case when a forgery is introduced in an original JPEG image and then resaved again in JPEG format. In such situation the forgery introduces some artifacts in the forged area. In this case, DCT coefficients of unmodified areas will undergo a double JPEG compression thus exhibiting double quantization (DQ) artifacts, while DCT coefficients of forged areas will result from a single compression and will likely present no DQ artifacts [12].

In the second case, we consider image splicing. In this kind of forgery, it is assumed that a region from a JPEG image is pasted onto a host image that does not exhibit JPEG compression statistics, and that the resulting image is JPEG recompressed. In this case, the forged region will exhibit double compression artifacts, whereas the non manipulated region will present no such artifacts [12].

In the first case, non-aligned double JPEG compression artifacts will be present if the original image is randomly cropped before being recompressed in JPEG format. In the second case, assuming that the forged region is randomly pasted in the new image, there is a great probability that block grids of the host image and of the pasted region will be misaligned thus showing non-aligned double JPEG compression artifacts.

Based on this analysis, we give the algorithm for generating the end if likelihood map indicating the probability for each DCT block to be doubly compressed in the presence of artifacts introduced by non-aligned double JPEG compression. The pseudocode as given in [13] is given below in Fig. 1.

input I<sub>2</sub>, N<sub>coeff</sub>, model,  $\alpha_0$ set L(I, j) = 1 estimate  $\mu_e$ ,  $\sigma_e^2$ {Estimate grid shift} set L<sub>max</sub> = - $\infty$ for all (r',c') do

input  $\bar{Q}_m$ , m = 1...,M<sub>1</sub> set  $\mathbf{x} = (\mathbf{D}_{\mathbf{r}'\mathbf{c}'}\mathbf{I}_2)_1$ estimate  $p_0(u)$ for all x do  $p(x|H_0) = p_{NO}(x)$  $p(x|H_1, \bar{Q}_m) = p_0(x; \bar{Q}_m), m=1...,M_1$ end for L <== Algorithm 1 if  $L > L_{max}$  then (r, c) = (r', c') $L_{max} = L$ end if end for for  $k = 1 \rightarrow N_{coeff} do$ input  $\bar{Q}_{m,m} = 1...,M_k$ set  $x = (D_{rc}I_2)_k$ estimate  $p_0(u)$ ,  $\mu_e$ ,  $\sigma_e^2$ for all x do  $p(x|H_0) = p_{NO}(x)$  $p(x|H_1, \bar{Q}_m) = p_0(x; \bar{Q}_m), m=1...,M_k$ end for  $Q_1 \le Algorithm 1$ if model = 0 then  $L(i, j) = L(i, j). p(x(i, j) | H_1; Q_1)$  $p(x(i, j) | H_0)$ else  $L(i, j) = L(i, j). n_0(x(i, j); Q_1)$ end if end for where: I is image. C is quantized DCT coefficients, U is unquantized DCT coefficients,  $D_{rc}$  is 8 × 8 block DCT matrix, grid aligned to (r, c) pixel position, O is quantization according to  $8 \times 8$  quantization

matrix,

D is dequantization according to  $8 \times 8$ 

quantization matrix,

x is generic DCT coefficient (either quantized

or not),

(r; c) is grid shift,

Q is quantization step,

k is DCT coefficient frequency index,

(i, j) is DCT block position within the image,

(. )k is select  $k_{th}$  DCT coefficient from each  $8\times 8$ 

block, and

L(i, j) is the likelihood map.

### Fig. 1: Pseudocode.

# Algorithm:

- 1. Let x be the DCT coefficient of an image.
- 2. Let  $p(x|H_1)$  be the conditional probability of being tampered for each DCT coefficient x of an image.
- 3. Let  $p(x|H_0)$  be the conditional probability of not being tampered for each DCT coefficient x of an image.

- 4. Assume that we know both  $p(x|H_1)$  and  $p(x|H_0)$ .
- 5. For the sake of our simplicity, we will consider only the second case discussed above, i. e.  $p(x|H_0)$  denotes the distribution of singly compressed coefficients, and  $p(x|H_1)$  is the distribution of doubly compressed coefficients.
- 6. A DCT coefficient *x* can be classified as belonging to one of the two models according to the value of the likelihood ratio

 $L(x) = p(x|H_1)$ 

 $p(x|H_0)$ 

- 7. Let  $x_k(i; j)$  denote *k*th DCT coefficient within the block at position  $(i; j)^1$ .
- 8. If multiple DCT coefficients within the same  $8 \times 8$  block are considered, by assuming that they are independently distributed we can express the likelihood ratio corresponding to the block at position (i; j) as  $L(i; j) = \prod L(x_k(i; j))$ k
- 9. Such values form a likelihood map of the JPEG image with resolution  $8 \times 8$  pixel, which can be used to localize possibly forged regions within the image.

	Detecting Copy Move	Detecting Image Splicing or Image Composites	Detection of Resampling	Detection based on Image Processing Operations	Detection based on JPEG Compression Properties
Comparison Criteria					
Frequency of Occurrence	most common image tampering technique[2]	commonly used image tampering scheme[2]	Almost as frequent as copy move forgery.	It is used often[2].	JPEG is most popular and commonly used compression standard which has been found in variety of applications[2]
Complexity of the Tampering	This tampering is used due to its simplicity and effectiveness[2]	Simple image tampering scheme[2].	Simple and effective operation.	Sometimes needs a little bit of knowledge	Easily done
Role of this type of Tampering in Image forgery Detection	The copy-move forgery brings into the image several near-duplicated image regions. So, detection of such regions may signify tampering[4].	It is a fundamental task in image forgery detection[2].	Detecting the specific statistical changes due to interpolation step can be identified as possible image forgery[2]. Therefore, by having sophisticated resampling/interpolation detectors, altered images containing resampled portions can be identified and their successful usage significantly reduced[4].	Detection of image processing operations results in identification of forgeries[2]	Most digital cameras export JPEG file format. To identify whether an image in bitmap format has been previously JPEG compressed or not is an important issue for some image processing applications and plays very important role in image tampering detection[2].

 Table 1: Comparison of different Passive Digital Image Forgery Detection Techniques Based on Tampering Operations

II	Dente of entries 1 increase in	·	XVII	T4 :	Deathle IDEC
How is this	Parts of original image is	involves replacing of	when two or more	It involves one or more	Double JPEG
Tampering	copied ,moved to a desired	image fragments from	images are spliced	of the following	Compression:
Carried Out	location and pasted[2].	one or more different	together, to create high	operations:	The Joint Photographic
	Textured regions are used	images on to another	quality and consistent	Image Filtering	Experts Group (JPEG) has
	as ideal parts for copymove	image[2].	image forgeries, almost	Operations, Sharpening	become an international
	forgery, since textured	011	always geometric	and blurring. Cropping	standard for image
	areas have similar color		transformations such as	and	compression. In order to
	and noise variation		scaling rotation or	recompression Brightness	alter a IPEG image
	and noise variation		skowing are needed[5]	and Contract[2]	trained a JIEO intage,
	properties to that of the		skewing are needed[5].	and Contrast[2].	typicany the image must
	image which are				be loaded onto a photo-
	unperceivable for human				manipulating software,
	eye looking for				decompressed and after
	inconsistencies in image				the editing process is
	statistical properties[2].				finished, the digital image
					must be compressed again
	Blurring is usually used				and re-saved. Hence, the
	along the border of the				newly created IPEG image
	modified region to lessen				will be double or more
	the effect of irregularities				times IPEG compressed
	hotware the original and				This introduces specific
	between the original and				this introduces specific
	pasted region[2].				detectable changes into the
					image. So, detection of
					these artifacts and the
					knowledge of images
					JPEG compression history
					can be helpful in finding
					the traces of tampering[4].
Why is this	Used for hiding certain	Nowadays image	When creating image	to conceal traces of	Tampering with a digital
Tampering	details or to duplicate	splicing image	composites, to give the	tampering often various	image requires the use of a
Used?	certain aspects of an	forgery is becoming a	image a more uniform	image processing	photo-editing software
	image[2]	common way the	aspect geometric	operations are applied to	such as Adobe PhotoShop
	go[_].	anti-social people are	transformations are	the images[2]	In the making of digital
		using to create the	needed These geometric	the muges[2].	forgeries on image is
		false photographs and	transformations tunically		loaded into the editing
		Take photographs and	inalision nations typically		loaded into the editing
		misusing them[6].	involve re-sampling (e.g.,		sontware, some
			scaling or rotating) which		manipulations are
			in turn calls for		performed and the image
			interpolation (e.g.,		is re-saved. Since most
			nearest neighbor,		images are stored in JPEG
			bilinear, bicubic)[2].		format (e.g., a majority of
					digital cameras store
					images directly in JPEG
					format), it is likely that
					both the original and
					forged images are stored in
					this format Nation that in
					this geoparie the format in
					ins scenario une forged
					image is double JPEG
					compressed[7].

How is the Tampering Detection Carried Out?	To detect copy move forgery, Discrete cosine transform (DCT) of the image blocks was used and their lexicographical sorting is taken to avoid the computational burden[2]. Once sorted the adjacent identical pair of blocks are considered to be copy- moved blocks[1].Also, a method using principal component analysis (PCA) for the overlapping square blocks[1]. Existing near–duplicated regions detection methods mostly have several steps in common: tiling the image with overlapping blocks, feature representation and matching of these blocks[28].	Splicing detection is a complex problem whereby the composite regions are investigated by a variety of methods. The presence of abrupt changes between different regions that are combined and their backgrounds, provide valuable traces to detect splicing in the image under consideration[1].	Existing detectors use the fact that the interpolation process brings into the signal specific detectable statistical changes[4].	Tampering detection is carried out by detecting the presence of any of the image processing operations. It can be done using the convolutional filtering and spectral filtering operations.Image quality measures can also be used for this purpose.There are few other methods for this tamper detection[2]	Double JPEG compression introduces specific artifacts not present in singly compressed images [8]. These artifacts can be used as evidence of digital tampering.
Limitations of the Detection Technique	<ul> <li>a. computationally expensive</li> <li>b. a human interpretation of the results is necessary</li> <li>c. they introduce high false positives</li> <li>d. few techniques often fails to detect the forgery when the size of the forged area is much smaller than image dimensions[2].</li> <li>e. Sometimes, even it makes harder for technology to detect the forgery, if the image is retouched with the tools that are available[10].</li> </ul>	a. fails when concealing measures, such as blur is applied after splicing when the edge sharpness cues are used for detection purpose a human interpretation of the results is necessary b. it requires straight edges c. edges should be wide enough so that edge profiles can be reliably extracted d. Sometimes manual labeling of image regions makes a particular approach a semiautomatic one e. highly localized and minor tampering will most likely go unnoticed and difficult to detect f. The compression artifacts make the localization of the forgery difficult when the image being analyzed is compressed by a low quality factor[2]	The detection accuracy lowers in JPEG images compressed using lower QF as the artifacts of JPEG compression conceal the traces of interpolation[2]. JPEG compression process creates its own correlation in image & may confuse resampling detectors[9]	Typically, in all the methods it is difficult to find the corrupted regions, when the noise degradation is very small.[2]	In case of Double JPEG compression based detection algorithms: a. Efficient and less time consuming algorithms need to be formulated b. reduce the false positive rateis needed[11] c. In Popescue's technique of detecting double JPEG compression based on histograms of DCT coefficients, images that are compressed first with a high quality, then with a significantly lower quality are generally harder to detect[2]

### 4. CONCLUSION AND FUTURE WORK

In this paper, we compared passive digital image forgery detection techniques based on tampering operations. Based on our analysis, we have identified the limitations in the field of image forgery detection. Also, a forensic algorithm to detect and localize a tampered area into a digital image by exploiting

the presence of non-aligned double JPEG compression artifacts has been proposed. This approach is similar to the one proposed in [12].

In the future, we will try to implement this algorithm practically for the detection of forged images. We would also include the analysis of aligned double JPEG compression artifacts for detection and localization of forgery in an image.

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