Information Hiding, 2008

# Residual Information of Redacted Images Hidden in the Compression Artifacts

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# Background

• Many images needed to be redacted before they are released to the public.



#### examples from WWW

	NEW I CONTINUAT	IAMPSHII	RE STATE POLIC	CE REPORT	
1. CASE NO. 2. INV MC07-4121 Se	ESTIGATING TROOPER ergeant Charles West	3. I.D. NO. 526	4. TOWN OF CRIME Franconia	5. TN. CD.	6. DATE OF REPORT May 11 2007
Dispatcher Henso	D OK dop't				
	officers en	route	closer to the situat	ion, we do ha	ve multiple
Chester Thompson	OK				
Dispatcher Henson	Um, so the	officer is de	own and the, the bal	d headed fell	ow is still up
Chester Thompson	He's still st	anding, he l	ias a, has the pistol	in his hand, p	ointing it at
	they came u	p the road,	n, the officer was in he stopped the car a	pursuit of th and then uh, t	is car uh when hey shot the guy
Dispatcher Henson	OK me ha				
sispatemer rienson	anything eso	e multiple c calates or ch	officers there now, s anges	sir, we'll uh, g	give us a call if
Chester Thompson	OK	ОК			
Dispatcher Henson	OK, thank y	OK, thank you			
emale Voice	Hey sir				
incoln Dispatch	Yah				
ispatcher Henson	Dispatcher H	lenson			
incoln Dispatch	Hi there, it's	Hi there, it's Lincoln Dispatch			
ispatcher Henson	r Henson Hi				
incoln Dispatch	Anything we	can do to h	elp you		
ispatcher Henson	Uh, we got ev	Uh, we got everybody headed, I guess Bruce McKay's been shot			
ncoln Dispatch	ОК	OK			
spatcher Henson	Um, we got other officers signing off there now				
ncoln Dispatch	Ok				
spatcher Henson	We're gonna Ambulance th	get a, actual at way, um.	ly if you wanted to I'll get the Woods	head your Li	ncoln

DSSP 102 (Rev. 08/94)

		Nations Unies	
то: А:	Mr. Bruno Henn, Officer-in-Charge Safety and Security Service Office of Central Support Services	DATE:	16 March 2005
		REFERENCE:	
THROUGH: S/C DE:			
FROM: DE:	Ahmad Fawzi, Direct <del>er UCCC</del> News and Media Division Department of Public Information		
SUBJECT: OBJET:	Revocation of Media Accreditation/	Grounds Pass – Ms. /	<b>a</b>
	An investigation into the letters of <b>Linear</b> to the Media Accreditation and United Nations accreditation has disclose forged letters under the name of the Ed newspaper.	assignment presented by Ms. Liaison Unit (MALU) in order sed that Ms. <b>Simun</b> has been itor and Managing Director of	submitting an Indian
	When contacted to confirm Ms. organization, the Editor of The Pioneer, in writing - by fax and email - that Ms Pioneer for any purpose"; that his signa the letters of assignment was "an outrig Ms. <b>Simular</b> appeared to be "computer g Assistant obtained accreditation to to "cancel her press credentials immedi this fraud had been going on since 2000 copies of Ms. <b>Simular</b> 's forgeries are att	"Is association with his ne Mr. Chandan Mitra, stated ca had "never been enga ture that is purported to be a hif forgery"; that the letterhee generated". He added: "Clearl the UN by fraud", he request etley", and said he was sorry 3. (Copy of Mr. Mitra's letter, a ached for ease of reference.)	ews tegorically ged by The ffixed to di used by y, Ms. ed the UN to find that is well as
	Because of the serious nature of th the past three years, I hereby revoke he made permanently and irrevocably inel- pass. As early as possible, MALU will at the past, will accompany her to Room S escort her from United Nations premised	te fraud perpetrated by Ms. accreditation, and request the gible for any type of United k trange for a temporary pass for 301 to clear out her desk, and ts.	for hat she be lations or Ms. I will then
	In light of this grave breach of the media accreditation, I would greatly ap Security Service in implementing this d	rules and regulations govern preciate your help in the Safe ecision.	ing UN y and
	Thanks, as always, for your kind c	ooperation.	
44	c: Mr. Shashi Tharoor Ms. Shirley Brownell Mr. Nikolay Bolshakov		

examples from WWW

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#### Type of redaction studied in this talk.

Personal History Survey

In each of the boxes below, please answer either only YES or NO.

Do you like the interface of this website?	NO
Do you like this company?	NO
Are you concerned about your reputation?	NO
Do you prefer smart wear over casual wear?	NO
Do you like to have longer hair?	NO
Do you believe in love in first sight?	YES
Are you concerned about your weight?	YES
Are you concerned about your height?	YES
Do you like spicy food?	YES
Do you like chocolates?	YES

#### constructed example

#### Type of redaction studied in this talk.

Personal History Survey

In each of the boxes below, please answer either only YES or NO.

Do you like the interface of this website?	
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Do you believe in love in first sight?	
Are you concerned about your weight?	
Are you concerned about your height?	
Do you like spicy food?	
Do you like chocolates?	-

#### constructed example

Pixels in the sensitive region are replaced by black/white pixels



#### How effective is digital redaction?

• Under certain conditions, we still can extract information from the surrounding pixels.

#### Main Observation

 Images are lossily-compressed or processed before redaction. Information in the sensitive region may has *spread* to the non-sensitive region before redaction.

Hence, replacement of pixels values in the sensitive region does not *completely* purge the sensitive information.

# **Compression Artifacts**



JPEG image

## **Compression artifacts**



Image enhanced to illustrated the artifacts

### Other types of redaction

• Physical redaction

overwritten with marker. cover with tape while scanning. cutting out the region.

- Redaction of non-pixel representation. redaction of pdf file.
- Information derived from content. for e.g. length of words covered.

- We are concern with digital redaction.
- Derive information from image processing artifacts.

Personal History Survey

In each of the boxes below, please answer either only YES

Do you like the interface of this website?	NO
Do you like this company?	NO
Are you concerned about your reputation?	NO

Personal History Survey

In each of the boxes below, please answer either only YES

Do you like the interface of this website?	-
Do you like this company?	
Are you concerned about your reputation?	-

I. Formulation: Redaction



From I<sub>3</sub>, *actual*  $\delta_2$  can be obtained, and an *estimate* of  $\delta_1$  also can be obtained

## Formulation: adversary's goal

• Given a redacted image I, where region containing a secret is removed.

An adversary has two templates  $T_0$ ,  $T_1$  derived from two possible values of the secret 0,1.

The adversary wants to guess which template is the original. If the chance of correct guess is

 $0.5 + \varepsilon$ , then  $\varepsilon$  is the advantage of the adversary.

 If adversary achieve non-zero advantage, the redacted image must has leaked some information of the secret.

#### **Redacted image I<sub>3</sub>**

Personal History Survey

In each of the boxes below, please answer either only YES or NO .

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Are you concerned about your reputation?	-
Do you prefer smart wear over casual wear?	
Do you like to have longer hair?	
Do you believe in love in first sight?	
Are you concerned about your weight?	
Are you concerned about your height?	
Do you like spicy food?	
Do you like chocolates?	-



#### II. Method 1: Estimate the Raw

- Suppose a good estimate, R, of the raw image in the nonsensitive region is available, then candidates of the whole raw image can be constructed.
- Simulate the redaction process and compare the outcomes.



• Suitable for JPEG.

• Difficult to apply to Wavelet-based compression schemes.

### Method 2: Quantization error

- Ignore effect of the 2<sup>nd</sup> compression (treat it as noise).
- Has an estimate of the raw image in the sensitive region (the 2 templates).
- Simulate the first compression to get an estimate of the compressed sensitive region.
- Obtain an estimate of I<sub>1</sub>. (the compressed original)
- $I_1$  should follow the statistics of images compressed with  $\delta_1$  (quantization error).



### **III.** Noise and parameters

- $\delta_1$ : Estimation of the 1<sup>st</sup> compression parameter.
- T<sub>0</sub>, T<sub>1</sub>: Estimation of raw image in the sensitive region (templates)
- R: Estimation of the raw image in nonsensitive region
- Size of redacted region.
- Compression schemes and rates.

#### **IV. Experiments**

• Two compression schemes:

JPEG: Quantization matrix

Wavelet-based compression: CDF 9/11wavelet, and uniform quantization.

#### Data sets

- Random Images.
- 2 images: Document + Photo.

1034x1494 pixels



Nokia 6125 mobile phone 640x480 "normal" compression quality

template derive from photo captured by digital cameras.







#### Effect of redacted region + noise on



Random images, JPEG, method 2,  $\delta_1 = 50$ ,  $\delta_2 = 95$ .

# The1<sup>st</sup> and 2<sup>nd</sup> compression



Random images, method 2, JPEG,  $\delta_1 = 50$ 

# Effect on estimation of $\delta_1$



Random images, method 2, JPEG,  $\delta_1 = 40$ ,  $\delta_2 = 90$ 

# Effect on size of redacted region



Random images, method 2, Wavelet,  $\delta_1 = 50$ 

# Comparison of method 1 and 2



Random images, JPEG,  $\delta_2 = 95$ , 3 col's redacted



Document image, method 2, JPEG,  $\delta_1 = 50$ 



Document image, method 2, Wavelet,  $\delta_2 = 1/100$ 

# Photo images(method 2)

	Quantization Error		Quantization Error
Random	123.0	Random	104.9
10-335	92.6	10-335	69.1
10-339	92.2	10-339	67.1
08-331	95.0	08-331	71.7
11-335	96.9	11-335	72.8
11-339	97.3	11-339	73.7

actual:10-335

actual:10-339

#### **Other details**

• Translation and Geometric distortion.

• Many DCT blocks.

## Conclusion

- When 2<sup>nd</sup> compression is of higher rate, adversary's success rate is high.
- Fortunately, typical images in public domain use lower rate for 2<sup>nd</sup> compression. (image scanned in high quality, redacted image stored in lower quality for fast downloading).
- Nevertheless, mobile phone camera is gaining popularity and images compressed in lower quality. Declassification of document images may not take the downloading speed as a consideration.
- Such subtle attack must still be taken into consideration when redacting sensitive images.
- Other similar attacks? A more accurate model and effective method.