

# Can stego images from a mobile phone stego app be detected?

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# Today's presentation

- Present errors in steg detection arising from four different software packages to mobile phone app PixelKnot
- There are no published results of steg detection on app data from mobile phones (that we could find)
- This is an important topic
  - Number of mobile phone apps performing steganography has increased in the past 5-7 years
  - Gives forensic practitioners a preliminary benchmark of some steg detection software packages
  - More practical scenario as it uses mobile phone pictures and apps
  - Recent: Australian government proposes to compel technology companies to provide access to users' messages, regardless of whether they have been encrypted (Guardian)



# Four software packages

- Stego Hunt (Wetstone, commercial software)
- StegDetect from DC3 (courtesy of Bill Eber, DC3)
- StegDetect from Dr. N. Provos (available on Internet)
- Academic pattern classifier (standard S.O.T.A. scenario)
- Explain process of detection by each method
- Discuss results, and where and why errors occur
- Encourage questions, feedback, comments



# What is steganography?

Steganography is the hiding of a message – "payload" – in an image



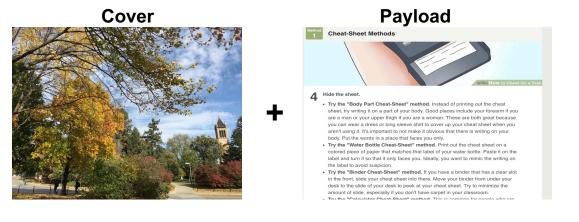
Steganography: "covered writing" (Greek)



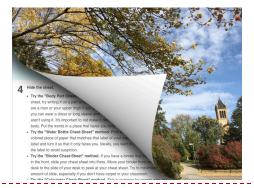


# What is steganalysis?

• Steganalysis is a digital image forensic tool to determine if an image has been altered to contain a hidden message



#### Stego



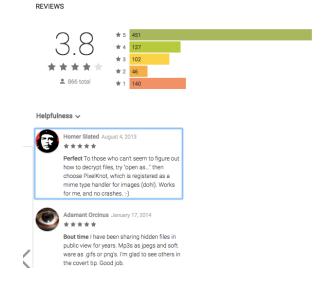




#### What is PixelKnot?



- Android app
- Uses sophisticated embedded algorithm (F5)
- Downloaded many times
- Higher rating than the "Will You Marry Me?" app (2.7/5)



#### ADDITIONAL INFORMATION

Email support@guardianproject.info

Updated	Installs	<b>Current Version</b>
February 17, 2017	100,000 - 500,000	1.0.1
Requires Android	Content Rating	Permissions
4.2 and up	Everyone	View details
2 00 0p	Learn more	view detaile
Report	Offered By	
Flag as inappropriate	The Guardian Project	
Developer		
Visit website		



# Steg Detection using Stego Hunt

- Stego Hunt is commercial software by WetStone
  - "leading software tool for discovering the presence of data hiding activities"
  - "generate case specific reports for management or court presentation"
  - "identify suspect carrier files: program artifacts, program signatures, statistical anomalies" using hash tables, file signatures, and statistics
- · Has 10 possible detection responses for a given scanned file



# Steg Detection using DC3's StegDetect

- DC3 StegDetect: courtesy of Bill Eber, DoD Cyber Crime Center (DC3)
- A software program that can be applied to many different types of files
  - We applied only to image files



# Steganalysis using Provos' StegDetect

- This StegDetect is NOT same as DC3's StegDetect
- Completely different computer program, developed by Dr. Neil Provos (now at Google)
- Can only accept jpg file images as input to scan
- Detects stego images output by steg embedding programs:
  - jsteg, jphide, and outguess 0.13b (all stegos are jpeg file format)
- Identifies the most likely program used to embed, if detected as stego



#### **Benchmarking Summary Table**

				Results of passing through:		
File Type	#	Cover or Stego	Embedding algorithm	Stego Hunt	DC3 StegDetect	Provos StegDetect
PNG Images	2090	Cover	(none)	1304 Carrier Anomalies <sup>1</sup>	0 suspicious	N/A <sup>2</sup>
JPG Images	1606	Cover	(none)	0 anomalies	0 suspicious	380/1606 = 24%
JPG Images	4818	Stego	PixelKnot	0 anomalies	0 suspicious	1160/4818= 24%
				399/421 Carrier	421/421: marked	
JPG Images	<b>421</b>	Stego	F5 exec. <sup>3</sup>	Anomalies <sup>1</sup>	as F5 <sup>4</sup>	223/421 = 53%
				10/10: data appended past	10/10: marked as	
PNG Images	10	Stego	Camouflage	EOF	Camouflage <sup>5</sup>	N/A <sup>2</sup>

File Type	name	Stego Hunt	DC3 StegDetect	Provos StegDetect
executable			0 suspicious	
executable	Camouflage	0 anomalies	0 suspicious	N/A <sup>2</sup>
source code	F5 (Java)	0 anomalies	0 suspicious	N/A <sup>2</sup>

Carrier Anomaly (shows inconsistent data structure)

#### Notes:

- Stego Hunt identifies Camouflage stegos, and anomalies in most F5 stegos.
- DC3 identifies Camouflage stegos, and identifies and extracts messages in all F5 stegos.
- · Neither Stego Hunt nor DC3 identifies PixelKnot stegos.
- Provos has high False Alarm Rate (24%) and high Missed Detection Rate (75%).
- Provos detects half of 421 as F5 stegos (219/421); rest identified as Outguess and jphide (4/421).

<sup>&</sup>lt;sup>2</sup> Provos StegDetect only works on JPG image format files

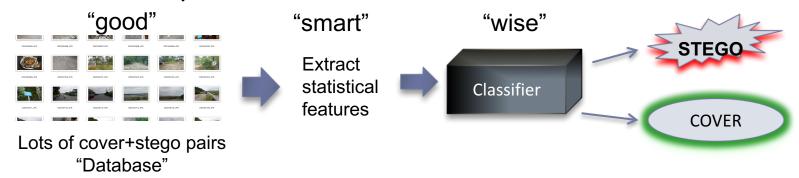
<sup>&</sup>lt;sup>3</sup> F5 executable code, downloaded from Internet, run on a Windows machine

<sup>&</sup>lt;sup>4</sup> DC3 did not extract embedded message for F5

<sup>&</sup>lt;sup>5</sup> DC3 also extracted password and embedded message for Camouflage

# Can we use a pattern classifier to detect PixelKnot?

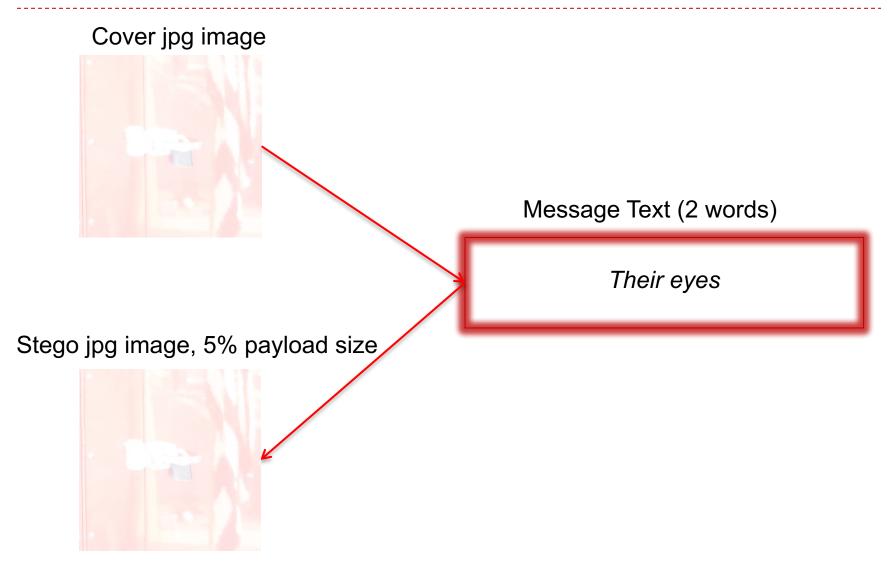
Can we use a pattern classifier to detect PixelKnot?



- We used our StegoDB Database to train classifiers
  - Reverse-engineered PixelKnot to batch create images in database
- Error calculated is average of false alarm rate + missed detection rate
  - Depends on many factors (training, testing data, features, etc.)
  - Does not identify blunders (wrongly labeled data, programming mistakes)
  - Does not identify lies in the training phase (data that is deliberately labeled incorrectly)

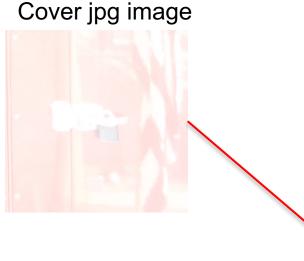


## Examples of Cover & Payload in PixelKnot: 5%



### Examples of Cover & Payload in PixelKnot: 10%





Message Text (20 words)

Stego jpg image, 10% payload size

That yet looks on me, or would know me Ariel, Fetch me the hat and rapier in my ce

### Examples of Cover & Payload in PixelKnot: 5%

#### Cover jpg image



Message Text (35 words)

stego jpg image with 5% payload size



And 'twixt the green sea and the azured vault Set roaring war: to the dread rattling thunder Have I given fire and rifted Jove's stout oak With his own bolt; the strong-based promontory

#### Examples of Cover & Payload in PixelKnot: 10%

#### Cover jpg image



Message Text (85 words)

stego jpg image with 10% payload size



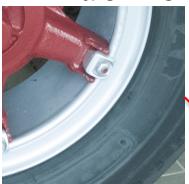
And ye that on the sands with printless foot Do chase the ebbing Neptune and do fly him When he comes back; you demi-puppets that By moonshine do the green sour ringlets make,

Whereof the ewe not bites, and you whose pastime Is to make midnight mushrooms, that rejoice. To hear the solemn curfew; by whose aid,

Weak masters though ye be, I have bedimm'd The noontide sun, call'd forth the mutinous winds, And 'twixt the green sea and

#### Examples of Cover & Payload in PixelKnot: 40%

#### Cover jpg image



stego jpg image with 40% payload size

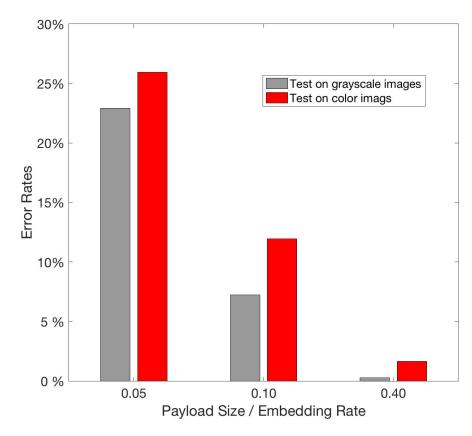


#### Message Text (350 words)

When he comes back; you demi-puppets that By moonshine do the green sour ringlets make, Whereof the ewe not bites, and you whose pastime Is to make midnight mushrooms, that rejoice To hear the solemn curfew; by whose aid, Weak masters though ve be, I have bedimm'd The noontide sun, call'd forth the mutinous winds, And 'twixt the green sea and the azured vault Set roaring war: to the dread rattling thunder Have I given fire and rifted Jove's stout oak With his own bolt; the strong-based promontory Have I made shake and by the spurs pluck'd up The pine and cedar: graves at my command Have waked their sleepers, oped, and let 'em forth By my so potent art. But this rough magic I here abjure, and, when I have required Some heavenly music, which even now I do, To work mine end upon their senses that This airy charm is for, I'll break my staff, Bury it certain fathoms in the earth. And deeper than did ever plummet sound I'll drown my book. A solemn air and the best comforter To an unsettled fancy cure thy brains, Now useless, boil'd within thy skull! There stand, For you are spell-stopp'd. Holy Gonzalo, honourable man, Mine eyes, even sociable to the show of thine, Fall fellowly drops. The charm dissolves apace, And as the morning steals upon the night, Melting the darkness, so their rising senses Begin to chase the ignorant fumes that mantle Their clearer reason. O good Gonzalo, My true preserver, and a loyal sir To him you follow'st! I will pay thy graces Home both in word and deed. Most cruelly Didst thou, Alonso, use me and my daughter: Thy brother was a furtherer in the act. Thou art pinch'd fort now, Sebastian. Flesh and blood, You, brother mine, that entertain'd ambition, Expell'd remorse and nature; who, with Sebastian, Whose inward pinches therefore are most strong, Would here have kill'd your king; I do forgive thee, Unnatural though thou art. Their understanding Begins t

#### Error Rates on PixelKnot classifier

- Trained on grayscale images
  - Less computationally expensive
- Tested on gray and tested on color
- Error rate: average of false alarms and missed detections
- Plot shows that the testing on color vs. grayscale images is not wildly different
  - Color has higher error because classifier did not train on color, only gray
- Our analysis shows that pattern classifiers with reasonable errors can be trained to detect stego images that are produced by mobile phone app PixelKnot





## Pros and cons of different detector types

- Advantages of pattern classification
  - General detection method, does not depend on signature of stego file
  - Can be retrained to include other types of stego if necessary
- Disadvantages of pattern classification
  - Could be time consuming to retrain to include other stego classes
- Advantages of signature-based
  - Very fast to execute
  - Can identify suspicious files in addition to stego images (executables, etc.)
- Disadvantages of signature-based
  - Need to update regularly
  - Signatures can change and then will not be detected



#### Conclusions

- Performance of existing steg detection software packages
  - Fast and can detect steg-related files other than images
  - Possible to extract message under certain circumstances
  - Not always reliable: can't detect stegos if signature is not in package
  - Some have high FAR and MDR
  - Database of hashed signatures can become outdated, and signatures missed
- Pattern classifiers can be trained on any data
  - PixelKnot stegos can be detected by classifiers, but not by software programs such as Stego Hunt, or either StegDetects (no signature)
- Our analysis shows that pattern classifiers with reasonable errors can be trained to detect stego images that are produced by mobile phone app PixelKnot



#### **Questions?**

- Do you try to detect steg in your labs?
- What is your experience in detecting steg?
- We welcome any feedback/discussion/suggestions.

