

# A Response to the Threat of Stegware

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# Steganography Introduction

- Practice of concealing a message (payload) within a cover image
- “Hidden in plain sight”



# Real-World Steganography Threats

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- Operation Shady RAT – 2006, one of the first large-scale attacks of steganography in malware\*
  - Downloaded HTML pages or JPEG images with hidden commands allowing access to local files\*
- Facebook embeds hidden data in downloaded images\*\*
- OceanLotus APT group – has used steganography to hide payload in malicious emails\*\*\*

\*Stegware – the latest trend in cybercrime, SIMARGL website. Link <https://simargl.eu/blog/technical/stegware-the-latest-trend-in-cybercrime>.

\*\*Facebook Embeds 'Hidden Codes' To Track Who Sees And Shares Your Photos, Forbes, July 2019.

Link <https://www.forbes.com/sites/zakdoffman/2019/07/14/facebook-is-embedding-hidden-codes-to-track-all-your-uploaded-photos-report/?sh=52b2c1961592>.

\*\*\*OceanLotus APT Uses Steganography to Shroud Payloads, ThreatPost, April 2019.

Link <https://threatpost.com/oceanlotus-apt-uses-steganography-to-shroud-payloads/143373/>.

# Goal: create a free, easy to use steganalysis tool

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- Steganography - used for passing messages secretly, can be used for dishonest purposes
- best steganography detection tools behind a paywall
- Open source, free steganalysis tools
  - Difficult to use
  - Inaccessible to many users
  - Use limited techniques

# Scope

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- Reverse Engineered 8 Apps from the Google Play Store or the App Store
  - 6 spatial embedding
    - MobiStego, PocketStego, Steganography-Meznik, Pictograph, Da Vinci, and Steganography Master
  - 2 JPEG embedding
    - PixelKnot and Passlok
  - Current tools focuses on the spatial embedding
  - PixelKnot – 100k+ downloads, current tools cannot detect

# McAfee Steganography Defense Initiative\*

Entirely web-based (-)

1 image  
selected for  
evaluation at  
a time (-)

## TRY IT OUT

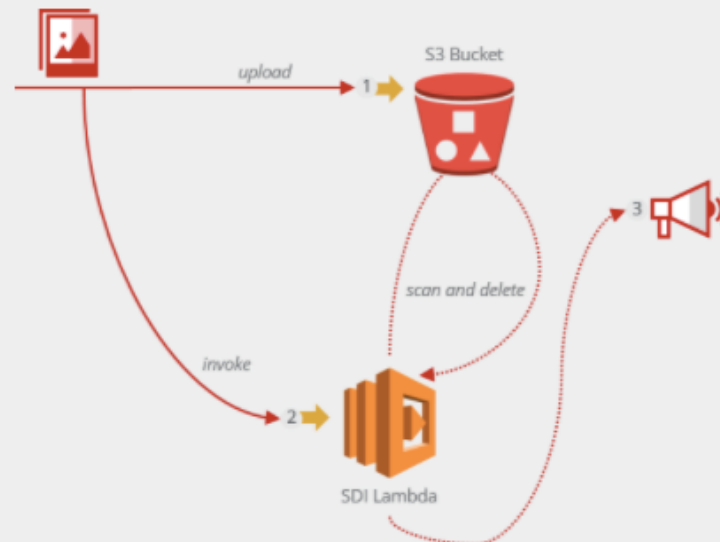
Simple to use, but difficult  
to understand results (+/-)

We are constantly improving detection capabilities, keep coming back for updated results

Drop here an image file  
to analyze for  
steganography

(\*) This is a constrained service, make sure the selected  
image is not larger than 1024x768 and the size is less  
than 1 MB

Image restricted to  
1024 x 768 with size  
less than 1 MB (-)



RESULTS

Suspicious: No - We can't find significant traces of  
steganography in this image  
Confidence Level: Low  
Score: 100.67968157389761  
Scan Time: 6760 ms  
Errors: false

No explanation of  
embedding algorithms  
tested or identified (-)



(\*\*) Processing time might vary between 1 and 25 seconds depending on multiple factors such as  
your current location, file size and format, and service load. Depending on the image format and  
amount of concealed data, this Beta tool may not always detect steganography.



# McAfee Steganography Defense Initiative

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RESULTS



Suspicious: Yes - Image might be concealing data using steganography  
Confidence Level: Low  
Score: 1000  
Scan Time: 598 ms  
Errors: false

(\*\*) Processing time might vary between 1 and 25 seconds depending on multiple factors such as your current location, file size and format, and service load. Depending on the Image format and amount of concealed data, this Beta tool may not always detect steganography.

# VSL – Virtual Steganographic Laboratory

The screenshot displays the VSL - Virtual Steganographic Laboratory interface. The main workspace shows a workflow diagram with three modules: 'Input' (green), 'LSB-RS' (green), and 'Report' (purple). The 'Report' module has a context menu open with options: 'Connect', 'Configure report...', and 'Remove'. A 'VSL Modules' panel on the right lists various modules: Input, Output, Display, Report, Encoders, Decoders, Analysers, LSB-RS, BSM-SVM, and Distortions. A 'VSL - configure Report module' dialog is open, showing the following settings:

- Folder: /Users/abbymartin/Downloads/vsl-1.1/results
- Name pattern: report
- Report type: Report latest
- Items to report:
  - ☒ number of iteration
  - ☒ number of Input
  - ☒ module IN
  - ☒ module OUT
  - ☒ image filename
  - ☒ image size
  - ☐ message size
  - ☒ PSNR
  - ☐ RPSNR
  - ☒ analysis result

The status bar at the bottom indicates 'Status VSL initialized.'.

Can select a folder of images as input (+)

Java program with a GUI (+)

Drag and drop and connecting boxes difficult to design experiments (-)

Performs 2 steganalysis methods (user can determine which tests to run) (+)





# VSL – Virtual Steganographic Laboratory\*

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- 1 line .csv results for each image (-)
- No label for data in each column (-)

	A	B	C	D	E	F	G	H	I	J	K	L
1	0	0	Input	LSB-RS	/Users/abby	1280x960	0	Estimated message size [B]:13400.867925139932				
2												
3												

\*<http://vsl.sourceforge.net/>

# StegExpose\*

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- Can select a folder of images as input (+)
- Results in .csv file include data for all images with clear headers (+)
- Processes only spatial domain, like PNG and BMP but not JPEG (-)
- Command line interface (-)
- Performs 4 steganalysis methods for each test (-)
  - User cannot determine which test to run (-)
  - User requires expert knowledge (-)

\*<https://github.com/b3dk7/StegExpose> and <https://arxiv.org/abs/1410.6656>

# StegExpose – Output Example

	A	B	C	D	E	F	G	H	I
1									
2	File name	Above stego threshold?	Secret message size in bytes (ignore for clean files)	Primary Sets	Chi Square	Sample Pairs	RS analysis	Fusion (mean)	
3	284598.JPG	FALSE	958	0.005123606	5.48E-04	0.02095071	0.022492712	0.012278725	
4	281386.JPG	FALSE	4835	0.081109726	0.083434562	0.034853155	0.029710251	0.057276924	
5	282857.JPG	FALSE	255	0.001556796	0.014181947	6.11E-04	0.0014959	0.00446152	
6	300840.JPG	FALSE	933	0.016228149	0.01753191	0.007379759	0.005664217	0.011701009	
7	273845.JPG	FALSE	1931	0.014320603	0.005720457	0.024131811	0.027134046	0.017826729	
8	316763.JPG	FALSE	878	0.01811262	0.005058481	0.009297059	0.010071228	0.010634847	
9	275005.JPG	FALSE	13073	NaN	0.018690814	0.089997303	0.087291931	0.065326683	
10	302266.JPG	FALSE	634	0.009836109	0.008052615	0.005167686	0.006446773	0.007375796	
11	284017.JPG	FALSE	555	0.00661696	0.016470589	0.001325162	0.002973589	0.006846575	
12	297043.JPG	FALSE	1021	0.021921626	0.003893836	0.010450683	0.011738511	0.012001164	
13	317657.JPG	FALSE	224	0.004716274	0.005219445	0.003005638	0.002170714	0.003778018	
14	269202.JPG	FALSE	1353	0.014766575	0.018128894	0.014390629	0.012226422	0.01487813	
15	281966.JPG	FALSE	1119	0.004830486	0.042422189	0.005189996	0.005278733	0.014430351	
16	261662.JPG	FALSE	1140	0.014126441	8.81E-04	0.019406499	0.016870804	0.012821087	
17	273266.JPG	FALSE	2772	0.029851826	0.005708502	0.031146482	0.029178695	0.023971376	
18	276478.JPG	FALSE	321	0.001539458	3.26E-04	0.003318019	0.006358429	0.002885383	
19	317079.JPG	FALSE	103	0.00229411	0.001214501	3.77E-04	0.002433275	0.001579658	
20	290664.JPG	FALSE	4006	0.031993337	0.049809867	0.020857106	0.021896288	0.031139149	
21	304005.JPG	FALSE	986	0.018523887	0.005521241	0.012695226	0.010802055	0.011885602	
22	298204.JPG	FALSE	887	0.021479483	0.004616699	0.006386527	0.007902735	0.010096361	
23	278482.JPG	FALSE	675	0.001492524	0.007263427	0.011931586	0.013784569	0.008618027	
24	272420.JPG	FALSE	662	0.01602584	0.002128061	0.008828943	0.008285	0.008816961	

◀ ▶
results
+

Ready
 

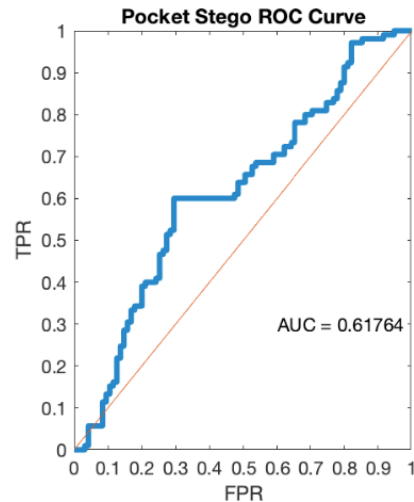
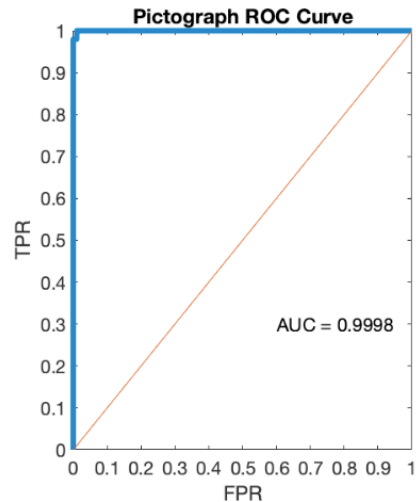
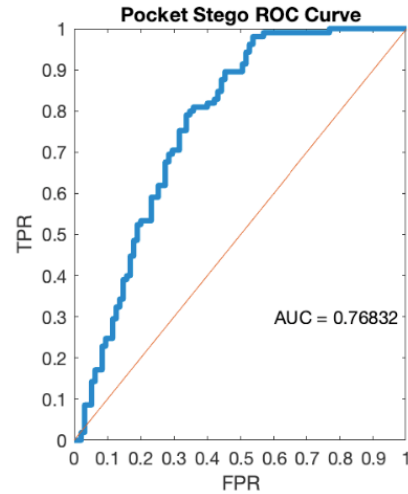
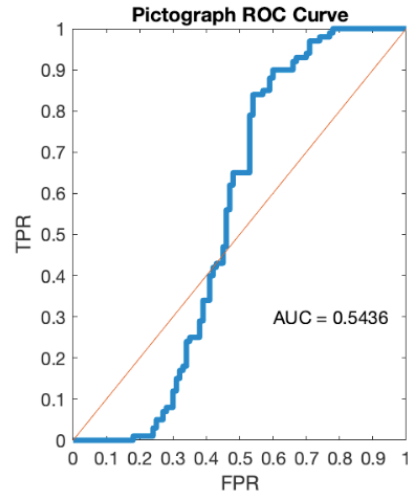


 150%

# StegExpose – Output Example

	A	B	C	D	E	F	G	H	I
1									
2	File name	Above stego threshold?	Secret message size in bytes (ignore for clean files)	Primary Sets	Chi Square	Sample Pairs	RS analysis	Fusion (mean)	
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21	304005.JPG	FALSE	986	0.018523887	0.005521241	0.012695226	0.010802055	0.011885602	
22	298204.JPG	FALSE	887	0.021479483	0.004616699	0.006386527	0.007902735	0.010096361	
23	278482.JPG	FALSE	675	0.001492524	0.007263427	0.011931586	0.013784569	0.008618027	
24	272420.JPG	FALSE	662	0.01602584	0.002128061	0.008828943	0.008285	0.008816961	

# Matlab Plots



## StegExpose Fusion Mean Results

- 100 cover images and 100 stego images
- Combination of 4 tests
- Only statistic used for evaluation of threshold

## StegExpose Chi-Square Results

- 100 cover images and 100 stego images
- Performs significantly better for Pictograph

# CSAFE Steg Detection Tool

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- GUI implementation
- Intuitive to operate
- Interpretable report in addition to a single, labelled .csv file
- Performs a variety of steganalysis methods, and allow the user to select which to run and parameters
- Processes of large sets of images easily

# CSAFE Steg Detection Tool

CSAFE Steg Detection Tool

Select Input:

Select Tests:


- ☒ Chi-Square
- ☒ Signature Based
- ☒ F5 Detection
- ☒ JPEG Detection

Select Report Location:

martin/Desktop/StegAnalysis/DraftTool/Steganalysis'

Report Name: Report

☒ Save summary statistics ☒ Save csv



# CSAFE Steg Detection Tool

The screenshot shows the CSAFE Steg Detection Tool interface. It features three main sections: 'Select Input:', 'Select Tests:', and 'Select Report Location:'. The 'Select Input:' section has an 'Add input folder' button. The 'Select Tests:' section has four checked options: 'Chi-Square', 'Signature Based', 'F5 Detection', and 'JPEG Detection', each with an 'Edit' button. The 'Select Report Location:' section has a 'Change Report Folder' button, a 'Report Name: Report' field, a 'Change report name' button, and two checked options: 'Save summary statistics' and 'Save csv'. At the bottom, there are 'Run' and 'Reset' buttons. A logo for CSAFE (Center for Statistics and Applications in Forensic Evidence) is visible in the bottom left. Four callout boxes provide additional information: 'Can select up to 3 folders for input Accepts any image format', 'Offers 4 categories of testing (including JPEG) and allows user to customize settings', 'Generates two formats of results, standard .csv and a pdf summary, and user can opt out of generating either', and 'Easy to reset to default settings to run a new set of tests'.

CSAFE Steg Detection Tool

Select Input:

Select Tests:

- ☒ Chi-Square
- ☒ Signature Based
- ☒ F5 Detection
- ☒ JPEG Detection

Select Report Location:

Report Name: Report


☒ Save summary statistics ☒ Save csv

Can select up to 3 folders for input  
Accepts any image format

Offers 4 categories of testing  
(including JPEG) and allows user  
to customize settings

Generates two formats of results,  
standard .csv and a pdf summary, and  
user can opt out of generating either

Easy to reset to default  
settings to run a new set of  
tests

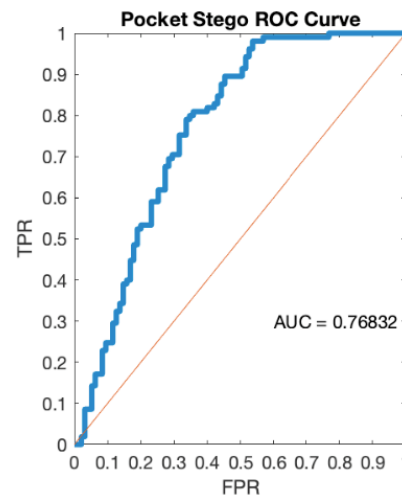
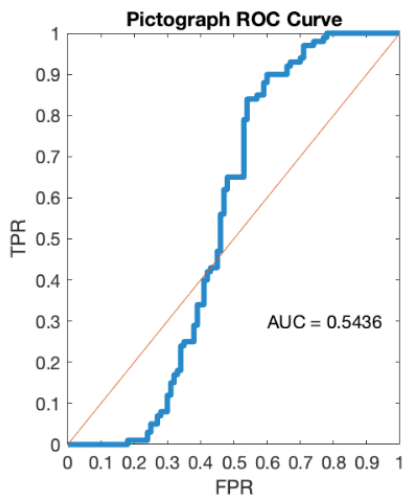
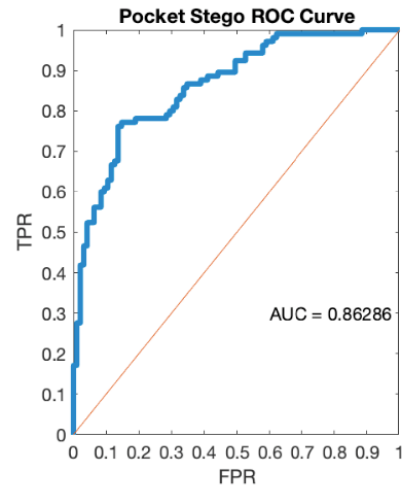
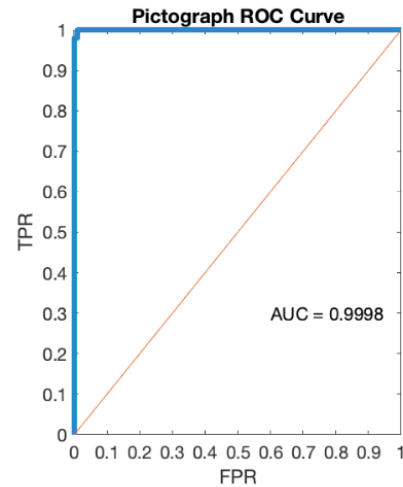
 **csafe**  
Center for Statistics and  
Applications in Forensic Evidence



# CSAFE Steg Detection Tool

	A	B	C	D	E	F
1	Image Name	Chi-LeftToRight-RGB	Chi-LeftToRight-Green	Sig-Davinci	Sig-Mobi	Sig-StegMaster
2	/Users/abbymartin/Desktop/Assortment/265748.PNG	0.002395729	0.003119954	FALSE	FALSE	FALSE
3	/Users/abbymartin/Desktop/Assortment/stego_6666458261_e455d262b5_z.png		0.128499314	FALSE	FALSE	FALSE
4	/Users/abbymartin/Desktop/Assortment/265749.PNG	0.002571864	0.002725523	FALSE	FALSE	FALSE
5	/Users/abbymartin/Desktop/Assortment/clean_7232193260_c2fd8c0f25_z.png	0.009962056	0.007267591	FALSE	FALSE	FALSE
6	/Users/abbymartin/Desktop/Assortment/clean_7231623538_f51db2a35a_z.png	0.05877201	0.031747764	FALSE	FALSE	FALSE
7	/Users/abbymartin/Desktop/Assortment/clean_7232220662_3d42c69109_z.png	0.037963372	0.09240086	FALSE	FALSE	FALSE
8	/Users/abbymartin/Desktop/Assortment/clean_7232202430_d38b6d6986_z.png	0.020347485	0.010554636	FALSE	FALSE	FALSE
9	/Users/abbymartin/Desktop/Assortment/612578.PNG	0.008460901	0.003680186	FALSE	FALSE	FALSE
10	/Users/abbymartin/Desktop/Assortment/clean_7235972310_8c25258da5.png	0.026697564	0.182082511	FALSE	FALSE	FALSE
11	/Users/abbymartin/Desktop/Assortment/612579.PNG	0.009179385	0.003680186	FALSE	FALSE	FALSE
12	/Users/abbymartin/Desktop/Assortment/846531.PNG	0.006031289	0.014629352	FALSE	FALSE	FALSE
13	/Users/abbymartin/Desktop/Assortment/846533.PNG	0.005629399	0.016119947	FALSE	TRUE	FALSE
14	/Users/abbymartin/Desktop/Assortment/clean_7234473324_bb8a82b5bd.png	2.91E-04	3.77E-05	FALSE	FALSE	FALSE
15	/Users/abbymartin/Desktop/Assortment/846532.PNG	0.005726428	0.015389714	FALSE	TRUE	FALSE
16	/Users/abbymartin/Desktop/Assortment/clean_7232206610_b8cfded120_z.png	0.100724817	0.114267965	FALSE	FALSE	FALSE
17	/Users/abbymartin/Desktop/Assortment/195688.PNG	0.004829148	0.0222082	FALSE	FALSE	FALSE
18	/Users/abbymartin/Desktop/Assortment/clean_7228718722_1cf25dff3e_z.png	0.039267846	0.107851466	FALSE	FALSE	FALSE
19	/Users/abbymartin/Desktop/Assortment/846535.PNG	0.007341794	0.0217039	FALSE	TRUE	FALSE
20	/Users/abbymartin/Desktop/Assortment/clean_7235558256_3099066753.png	0.031068078	0.064081654	FALSE	FALSE	FALSE
21	/Users/abbymartin/Desktop/Assortment/846534.PNG	0.0071134	0.018836055	FALSE	TRUE	FALSE
22	/Users/abbymartin/Desktop/Assortment/195686.PNG	0.004573079	0.024630413	FALSE	FALSE	FALSE
23	/Users/abbymartin/Desktop/Assortment/clean_7221186570_82a10bc040_z.png	0.073688361	0.080730233	FALSE	FALSE	FALSE
24	/Users/abbymartin/Desktop/Assortment/195687.PNG	0.004419625	0.021339742	FALSE	FALSE	FALSE
25	/Users/abbymartin/Desktop/Assortment/195685.PNG	0.003980416	0.022924317	FALSE	FALSE	FALSE
26	/Users/abbymartin/Desktop/Assortment/195684.PNG	0.00398992	0.024566193	FALSE	FALSE	FALSE

# Results Comparison



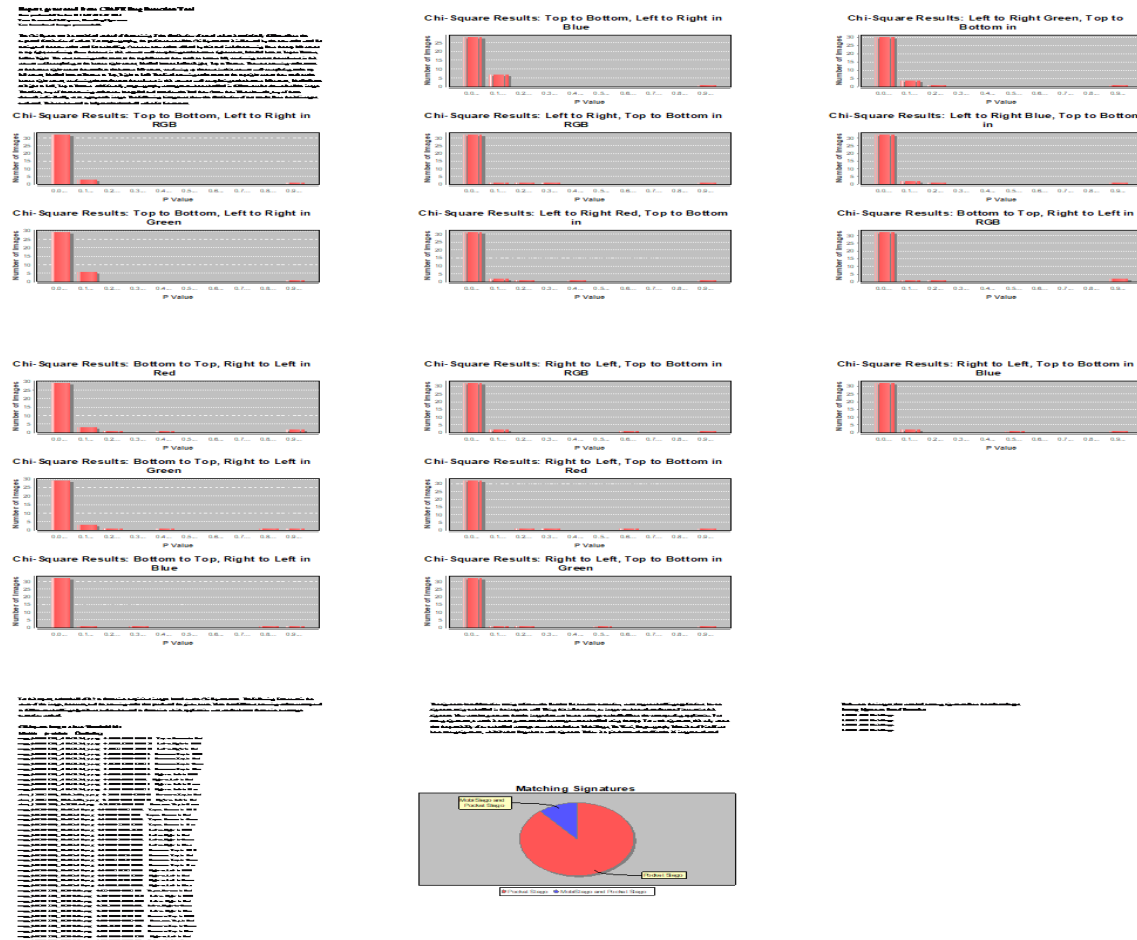
## CSAFE Steg Detection Tool Results

- 100 cover images and 100 stego images
- Can select different scan orders

## StegExpose Fusion Mean Results

- 100 cover images and 100 stego images
- Combination of 4 tests
- Only result used for evaluating with threshold

# CSAFE Steg Detection Tool Report



# CSAFE Steg Detection Tool Report

## Report generated from CSAFE Steg Detection Tool

Date produced: Tue Jan 19 10:53:16 CST 2021

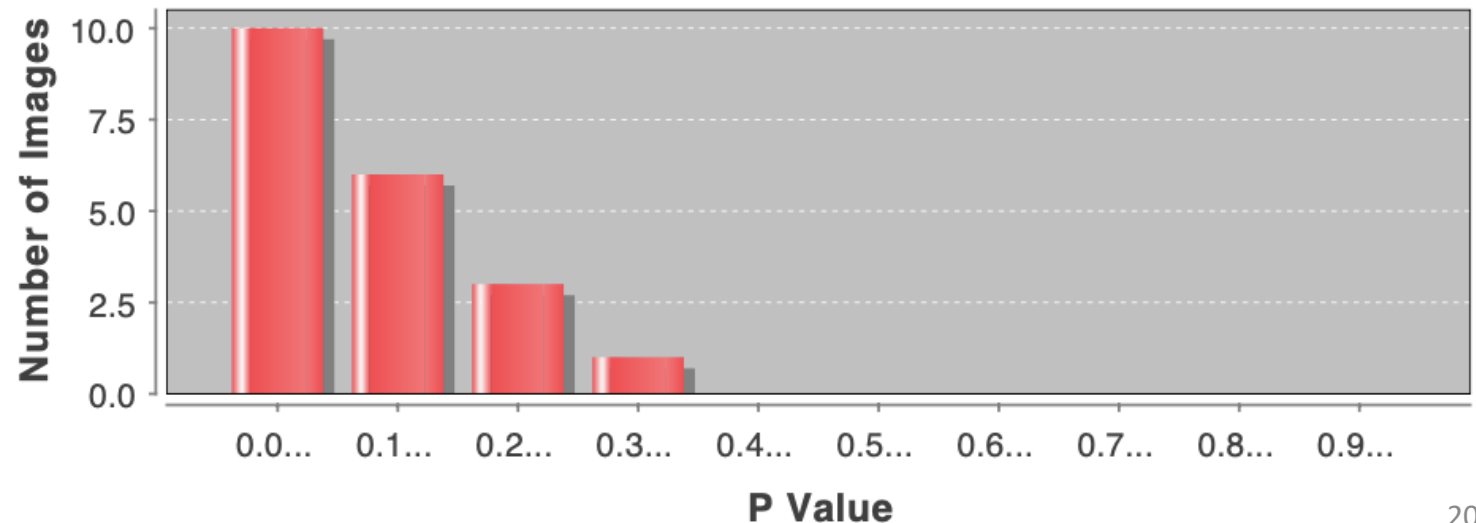
Tests Executed: Chi-Square, Matching Signatures

Total number of images processed: 20

Summary of experiment settings and relevant information for understanding each test

The Chi-Square test is a statistical method of determining if the distribution of actual values is statistically different from the expected distribution of values. For steganography, the performance of the Chi-Square test is influenced by the scan order used for testing and the scan order used for embedding. Common scan orders include Left to Right, Top to Bottom, and Bottom to Top, Right to Left. The next scanning order starts at the top left corner and scans in a manner until completing at the bottom right corner, labelled here as Bottom to Top, Right to Left. The next scanning order starts at the bottom right corner, continuing the read across the columns

## Chi-Square Results: Bottom to Top, Right to Left in Green



Visualization of results and data for a better understanding

# CSAFE Steg Detection Tool

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- Future Plans
  - Extend signature detection to additional applications (both for spatial and JPEG embedding)
  - Add additional statistical detection methods
  - Continue to refine design of GUI and the generated report
  - Collect signature patterns for all existing Android Stego Apps

# Thank You!

- This work was partially funded by the Center for Statistics and Applications in Forensic Evidence (CSAFE) through Cooperative Agreement #70NANB15H176 between NIST and Iowa State University, which includes activities carried out at Carnegie Mellon University, University of California Irvine, and University of Virginia.