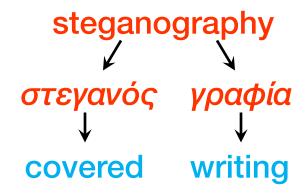
Lecture Notes

CS 419: Computer Security

Week 13: Hiding Communication Steganography

Paul Krzyzanowski

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The art of secret writing.

Oxford English Dictionary

Steganography

Hiding the existence of a message

Undetectability: An observer should not realize that hidden data is present

Defining characteristics

- The cover object appears untouched
 - The modifications should be invisible and statistically difficult to detect
- The hidden data is the payload
 - You embed arbitrary messages to transmit secretly
- 3. Adversary model: detection is the threat
 - If an analyst suspects the content contains hidden data, the mission fails

Watermarking

Embedding information into content

Persistence, not secrecy: The data should survive transformations

Defining characteristics

- 1. The watermark does not need to be hidden Some might be invisible, but secrecy is not required.
- 2. The watermark is tied to the object, not a message payload It could include ownership, license information, or tracking data
- 3. Adversary model: removal is the threat
 The watermark should survive cropping, compression, resampling, screenshotting, etc.

Watermarking vs. Steganography

Both techniques embed a message in data. Often used interchangeably

Goal of <u>steganography</u>: secrecy ⇒ conceal a message

- Intruder cannot detect there's a message in the content
- Primarily used for 1:1 communication

Examples: invisible ink, embedding secret text into an image

Goal of <u>watermarking</u>: identification ⇒ preserve a message

- Embed authorship or authenticity information into content
- Presence is intended: Doesn't have to be invisible
- The goal is to detect the watermark and preserve it
- Primarily used for 1:many communication

Examples: show that a photo belongs to Getty images, embed a logo in a TV show

Watermarking: Sample Applications

Encoding identifiable information (called a watermark), into content like images or video, to claim ownership or verify authenticity

Applications

- Copyright/creation affirmation
 - Embed information about owner
 - Label Al-created content
- Copy protection rules
 - Embed rights management information
 - But you need a trusted player
- Content authentication
 - Detect changes to the content

Fragile vs. Robust Watermarking

Fragile watermarks: designed to break if the content is modified

- This is good for authentication and tamper detection
- Examples: currency, passports, entry tickets
 - These will no longer be valid if tampered users should not want to remove them

Robust watermarks: designed to survive transformation

- This is good for tracking content authorship and ownership
- Examples: photos, videos, audio, documents
 - Users may try to remove these

Classic techniques in watermarking

Change thickness of paper while wet via a pattern in the paper mold

- First used in 1282: identify paper maker or trade guild that made the paper
- The dry paper could be rolled again to create even thickness but varying density
- Later used in banknotes to enable detection of authentic banknotes
 - First used in 1661 issue of the Stockholms Banco



Watermarking: EURion constellation (Omron rings)

- Series of five small images are repeated throughout the banknote
- Software recognizes the pattern to prevent scanning

• Used by the Armenia, Australia, Canada, China, EU, India, Japan, Mexico,

Switzerland, Thailand, UK, U.S, ... Zimbabwe







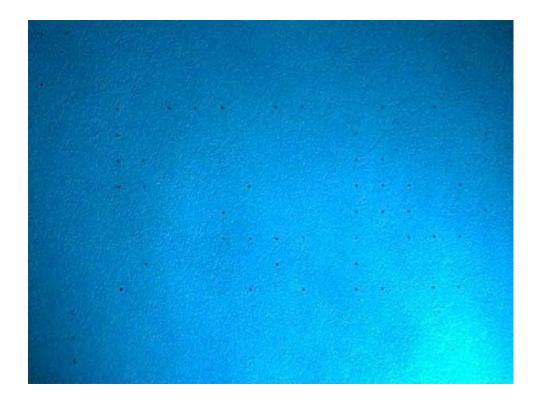
Machine ID codes in laser printers

Watermark added by the manufacturer to identify the printer used to create printed content

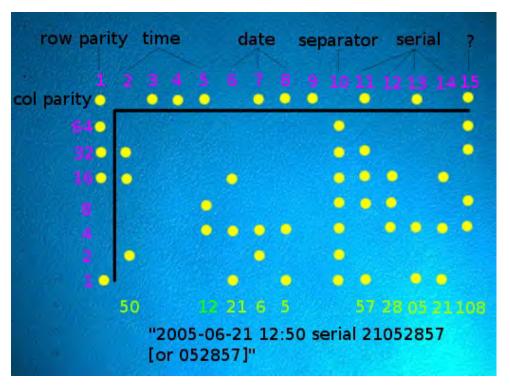


See http://www.eff.org/Privacy/printers/

Machine ID codes in laser printers



Machine ID codes in laser printers



Designed by Xerox to identify counterfeit currency and help track down counterfeiters

UV Watermarking







Passports (Canada↑, Hungary↓)



Also, currency, hand stamps for amusement park/club re-entry

Fragile vs. Robust Watermarking

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Classic techniques in steganography

Invisible ink (1st century AD - WW II)

 Used from antiquity through World War II. Lemon juice, vinegar, milk, cobalt chloride, and sympathetic inks.

Messages hidden on the body

 Herodotus describes shaving a slave's head, writing a message on the scalp, and waiting for the hair to grow back.

Wax covered tablets – ancient Greece

- Herodotus described messages carved into wood underneath a wax writing surface

Altered printed characters

- Letters slightly overwritten with pencil or ink to signal a code.
- Similar variants include smudges, underlines, or bent type from manual presses.

https://www.giac.org/paper/gsec/3494/steganography-age-terrorism/102620

Classic techniques in steganography

Pin-prick codes in printed text

Micro-perforations over selected letters in typewritten text, books, or newspapers

Microdots (early 20th century) – first used in 1941

Photographically reduced images the size of a typographic period; widely used in WWII espionage.

Newspaper clippings, knitting instructions, XOXO signatures, report cards, ...

- Charles Dickens in A Tale of Two Cities, describes a fictitious account how knitting patterns were used during the French Revolution to pass information on who was going to die
- WW II war censors eventually prohibited or tampered flower deliveries, radio song requests, weather reports, children's drawings sent in the mail, ...

Null Cipher (concealment cipher)

- Hide message in a large amount of irrelevant data
- Agreed technique for extracting content
 - First letter of each word, Nth letter of each word
 - Some specific pattern to define which words or letters are significant (e.g., 4-5-5-4 words)

Null Cipher (concealment cipher)

Sent by a German spy in WWI:

APPARENTLY NEUTRAL'S PROTEST IS THOROUGHLY DISCOUNTED AND IGNORED. ISMAN HARD HIT. BLOCKADE ISSUE AFFECTS PRETEXT FOR EMBARGO ON BYPRODUCTS. EJECTING SUETS AND VEGETABLE OILS.

Reference: David Kahn, The Codebreakers, p. 521

Null Cipher (concealment cipher)

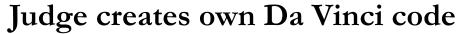
The 2nd letter of each word contains the message

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APPARENTLY NEUTRAL'S PROTEST IS THOROUGHLY DISCOUNTED AND IGNORED. ISMAN HARD HIT. BLOCKADE ISSUE AFFECTS PRETEXT FOR EMBARGO ON BYPRODUCTS. EJECTING SUETS AND VEGETABLE OILS.
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PERSHING SAILS FROM NY JUNE I

By WWII, not used by spies but by regular people trying to beat the censor.

Reference: David Kahn, The Codebreakers, p. 521





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The judge who presided over the failed Da Vinci Code plagiarism case at London's High Court hid his own secret code in his written judgement.

Seemingly random italicised letters were included in the 71-page judgement given by Mr Justice Peter Smith, which apparently spell out a message.

Mr Justice Smith said he would confirm the code if someone broke it.

"I can't discuss the judgement, but I don't see why a judgement should not be a matter of fun," he said.

Italicised letters in the first few pages spell out "Smithy Code", while the following pages also contain marked out letters.

Motivation

Steganography received little attention in computing until recently

- Industry's desire to protect copyrighted digital work
 - Detect counterfeit, unauthorized presentation, embed key, embed author ID
 - This is mostly watermarking (more on that later)
- Covert way to distribute malware bypass detection
 - E.g., embed in a JPEG file, which would raise no suspicion when downloaded
- Covert way to exfiltrate data
 - Upload harmless-looking content that contains embedded data
 - Network steganography: embed the secret data within unused data fields, headers (example, communicate with C2 servers via TXT fields in DNS messages

Steganography ≠ Copy protection ≠ Cryptography

Malware delivery & exfiltration via steganography

Trick content-inspecting firewalls by disguising malware and/or data

Data Exfiltration

- Russian hackers hid malware in a trojanized update from SolarWinds, a popular IT management platform – this included a backdoor
 - Successfully breached Cisco, Intel, Microsoft, and U.S. government agencies
 - Used network steganography to hide command-and-control communications inside ordinary-looking DNS traffic
 - Later, exfiltrated stolen information as XML files via HTTPS to disguise content

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Malware delivery & exfiltration via steganography

Malware Infiltration

- 2019: A nation-state actor also used steganography to hide Windows DLLs (dynamic linked libraries) inside of WAV files to install a cryptomining app
- 2020: Attackers embedded skimming malware in SVG graphics in an attack on Dutch eCommerce platform Sansec – JavaScript would parse it out.
- 2020-2023: Turla APT: JPEG steganography for C2 instructions
 - Used PNG and JPEG images posted on public websites to conceal secondary-stage payloads & command-and-control information
- 2023: PolyglotDuke: C2 Instructions embedded in PNG social media images
 - Pro-Russian group distributed images on X and other platforms that contained hidden instructions identifying targets for DDoS campaigns.

Steganography has now become common in low-end commodity malware, not just nationstate operations

Code hidden in photo, files stolen: Upstate man syracuse.com stole GE technology to try to help China

Anne Hayes • April 1, 2022

Schenectady, N.Y – A Schenectady County man who hid data in the code of a digital photograph of a sunset was convicted Thursday of conspiracy to commit economic espionage against General Electric in order to benefit the Chinese government.

Xiaoqing Zheng, 59, was originally accused of stealing GE trade secrets regarding turbine technology and planning to give the information to contacts in China, according to federal court documents.

Although the jury convicted Zheng, a U.S. citizen, of conspiracy to commit economic espionage, they could not reach a unanimous decision regarding the charge of economic espionage, according to a news release from the U.S. Attorney's Office of the Northern District of New York.

. . .

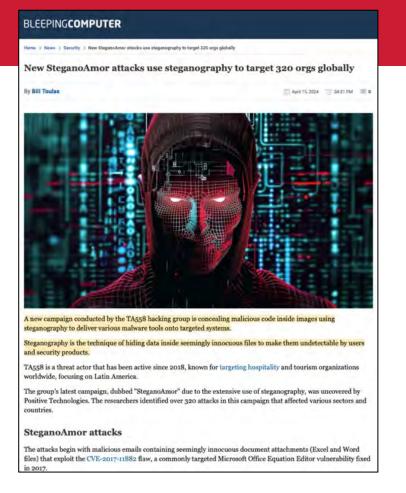
In 2018, Zheng used a means of hiding data within the code of another file to conceal 40 files in the code of a digital photograph of a sunset. He then emailed the photograph file to his personal email account, according to court documents.

URhttps://www.syracuse.com/crime/2022/04/code-hidden-in-photo-files-stolen-upstate-man-stole-ge-technology-to-try-to-help-china.htmlL

SteganoAmor

2024 attack campaign

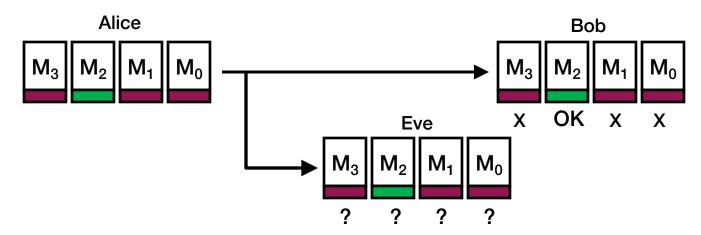
- Attacker sends emails with "harmless" content exploiting a vulnerability in the Microsoft Office Equation Editor
 - Memory corruption vulnerability: stack buffer overflow overwrites the return address to execute the attacker's code
 - The victim has to open the file to activate this
- When the attachment is opened, it sends a request to a URL to download an RTF document. When opened, it runs a VBS script that fetches payload embedded in images in URLs



https://global.ptsecurity.com/analytics/pt-esc-threat-intelligence/steganoamor-campaign-ta558-mass-attacking-companies-and-public-institutions-all-around-the-world

Chaffing & Winnowing

- Separate good messages from the bad ones
 - Easy for someone who has the key, difficult for someone who does not
- Stream of un-encoded messages with signatures or MACs
 - Some signatures are bogus
 - Need to have the key to test



Steganography in images

Spatial domain: LSB steganography

- Replace low-order bits of selected pixels with the message
- Option: use a pseudo-random schedule to identify which pixels to use

Frequency domain - work on transformed coefficients, not raw pixels

- Like JPEG compression: embed signal in mid- to high- frequency bands
- Alter the least perceptible parts of the image to avoid detection
 - But watch out: these are the same bits targeted by lossy image compression software (such as jpeg)

Metadata

- Add information the end of a PNG image's metadata or EXIF header
- This doesn't count as steganography because it's not really hidden but casual observers won't see it





Just the picture

With the U.S. Declaration of Independence embedded



There are differences – but you don't notice them in the photo

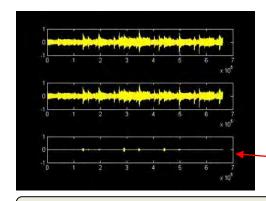
The choice of *cover* medium (the content the casual user sees) is crucial:

Media with high noise (photos, music) works better because small changes are less noticable.

Audio

Perceptual coding

- Inject the signal into areas that will not be detected by humans
- LSB steganography can also be used
- May be obliterated by compression



Amazon MP3 audio

Identifies where the song was purchased, not the user

Difference

Echomodulation Audio Watermarking

Adds low-amplitude echoes into the audio.

Too subtle for humans to perceive, but a decoder can detect them Goal is robustness.

Spread Spectrum Audio Watermarking

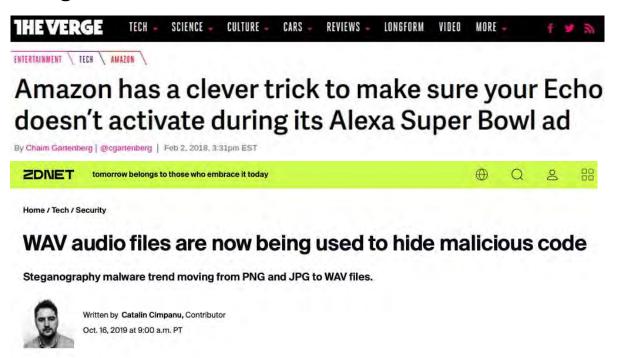
Used by Universal Music Group on Spotify audio – but largely dying out now. Still present on some music.

Intrasonics

Intrasonics (now Ipsos) – embeds watermarks into ads so clients can track source & medium used to transmit ad using echomodulation.

Audio

Amazon used inaudible signaling to prevent Echo devices from activating during its ads



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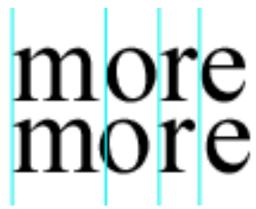
Video steganography & watermarking

Video = images + soundtrack

- Coding still frames spatial or frequency
- Modify motion vectors
- Caption/subtitle data
- Audio channel
- Visible watermarking
 - used by most networks (logo at bottom-right)
 This isn't steganography!

Text

- Text lines shifted up/down (40 lines text ⇒ 2⁴⁰ codes)
- Word space coding
- Character encoding minor changes to shapes of characters



Works only on "images" of text e.g., PDF, postscript

Text-based steganography

"Apparently, during the 1980's, British Prime Minister Margaret Thatcher became so irritated at press leaks of cabinet documents that she had the word processors programmed to encode their identity in the word spacing of documents, so that disloyal ministers could be traced."

- Ross Anderson Stretching the Limits of Steganography

Text – non-visual

- Embed zero-width non-printing characters
 - Zero-width space or zero-width non-joiner (used to prevent ligature use)
- White text on white background
- Overlapping objects
- PDF hidden pages
- HTML invisible text designed to be picked up by search engines
 - Non-rendered text (CSS element to not display text)
 - White on white
 - Obscured by other objects

Watermarking Al-Generated Text

Google SynthID: images & text

Goal: Identify LLM-generated content, realizing that text can be easily altered to remove any watermarks

- Images: makes tiny, structured modifications to an image's internal feature representation during generation.
- Text: Alters some words that a chatbot outputs to "introduce a statistical signature into the generated text"
 - SynthID-Text randomly assigns scores to candidate words that may be generated by the LLM and has the LLM output words with higher scores
 - A detector can then calculate the over
- Acknowledged to be "far from foolproof"
 - Users can make significant edits or ask another chatbot to summarize the text

https://spectrum.ieee.org/watermark

IEEE Spectrum

MAN MATTERCONO (BYTT) ASSESSED

Google Is Now Watermarking Its AI-Generated Text> But the DeepMind technology isn't yet a practical solution for everyone

BY SELTA STREETMANN | TO DET THEN | 4 REN READ |

Ciscs Stringians as a margar Editor at 1985 Apestrum squarting Al and Sizemisal engineering.



SHEET STREET, CHARLES

The chatbot revolution has left our world awash in Al-generated text: It has infiltrated our news feeds, term papers, and inboxes: It's so absurdly abundant that industries have sprung up to provide moves and countermoves. Some companies offer services to identify Al-generated text by analyzing the material, while others say their tools will "humanize" your Al-generated text and make it undetectable. Both types of tools have questionable performance, and as chatbots get better and better, it will only get more difficult to tell whether words were strung together by a human or an algorithm.

Here's another approach: Adding some sort of watermark or content credential to text from the start, which lets people easily check whether the text was AI-generated. New research from Google DeepMind, described today in the journal Nature, offers a way to do just that. The system, called SynthID-Text, doesn't compromise "the quality, accuracy, creativity, or speed of the text generation," says <u>Pushmeet Kohli</u>, vice president of research at Google DeepMind and a coauthor of the paper. But the researchers acknowledge that their system is far from foolproof, and isn't yet available to everyone—it's more of a demonstration than a scalable solution.

Watermarking Al-Generated Voice

Meta AudioSeal

Goal: detect Al-generated speech to mitigate risks like voice cloning & misinformation

Localized detection

 Embeds watermark into the audio in a way that it could be detected from even small sampled segments

Imperceptible

Balances watermark strength with psychoacoustic principles

Robust

- Detectable after common manipulations such as bandpass filtering, speed changes, compression (e.g., MP3 encoding)
- Uses psychoacoustic models to identify regions of audio that are both perceptually significant and resilient to compression

Efficient

Single-pass detection with no need for synchronization

Proactive Detection of Voice Cloning with Localized Watermarking

Robin Sun Rimma "1 Please Fernandes" Hady Floukar Alexandre Definees " Teddy Furum" Tuan Tran

Abstract

In the rapidly evolving field of spench gener aine models, there is a pressing med to ensure radio authenticity against the risks of voice aloning. We present AudioSeal, the first audio watermarking technique designal specifically for localized detection of Al-generated speech. AudioSeal employs a generator / descury architecture trained jointly with a livealization loss in enable localized watermark distriction up to the sample level, and a novel perceptual less instrived by auditory masking, that grafiles AqdioSeal to achieve better improveptibility. AuditSeal achieves state-of-the-art performance in terms of robustness to real life and/o maripulaters and impresortability based in automatic and human evaluation metrics. Additionally, AudioSeal is designed with a fast, single year densetor, that significantly surpasses existing models in speed, achieving detection up to two-orders of magnitude faster, making it ideal for targe-scale and real-time applications. Code is available at with abcount, and posternous being a pro-

1. Introduction

SDI

Generative speech models are time capitals of synthaning visions that are initiating unballed from roll areas (Aciilia). 2015; Monto et al., 2015; Common et al., 2015; Wing et al., 2015). Though speech generation and visive cleaning are left overlet complete, their recent advancements in quality and accombilities have raised new security in notions. A postable institution recented where a damptide aniso minimalringly upper US visions in abundar, show-cating the polimical for raisoning these volumbages in expend about information (Marphy et al., 2015). Regulature and generations are implementating sensers for AC common transparency and

"Equal contribution "FAIR, Mera Terra Westain, Communication to -crobines, hange ballon, physiciants, areas."

Proceedings of the 41^{et} International Conference on Machine Learning, Victore, America. PMLR 215, 2024. Compress 2024 by the author(s).



Figure 1. Proceeding desiration of Al-generated speeck. We conbed an impressipation of successors in the solids. Aftail can be tood to factor if a quart. In Al-generation and density the model that presented in D use also precisely proposed Al-generated segments in a lineary and on the according by the proposed of the preton a lineary and the solid in the precise of the precise of the present of the precise of the precise of the precise of the presentation of the precise of the precise of the presentation of the precise of the precise of the presentation of the precise of the precise of the presentation of the precise of the precise of the presentation of the precise of the precise of the preparation of the precise of the preparation of the precise of the preparation of the precise of the preton of the precise of the precise of the preton of the precise of the preton of the precise of the precise of the preton of the precise of the precise of the preton of the precise of the precise of the preton of the precise of the precise of the precise of the preton of the precise of the precise of the preton of the precise of the precise of the precise of the preton of the precise of the precise of the precise of the preton of the precise of the precise of the precise of the preton of the precise of the precise of the precise of the preton of the precise of t

incombility, including forensics and watermarking - see

The man formers approach to detect synthesized sistin is that brancy classifiers to discriminate between satural and explanation andress, a technique in lightlyful of in stakes by Barrier and (1922), Klassifiers or at (1923); Klassifiers and (1923); Klassifiers and description and the state of the authors source. Aboth better as subjective and managine for the authors source. Aboth better a simulation was disposed in the fifteeness between synthesized and authorities content diminishers.

Maximusking retenged as a steerg alternative. It embods a upstill in the gracerold work, representable to the or has minusky aftercible by specific algorithm. Then are pass sustementing types, multi-bit and zero-bit. Zero-bit summurking detects the precinc of absolute of a winter-multing detects the precinc of absolute of a winter-multing righted a binary message in the centain. allowing as to fine order to a specific course of generations model. More deep learning based mades watermarking methods for the content of a precipit course of generations model. More deep learning based mades watermarking multiple and the They could a generator to output the watermarking and the They could a generator to output the watermarking and the They could be research.

Conseat watermeeting treefleeds have limitations. First, they are not adapted for detection. The initial applications assumed any season comple under tentiny was watermeeted (e.g. IF protection). As a sould, the decoders were never

C2PA Standard (c2pa.org)

Coalition for Content Provenance and Authenticity

- Alliance between Adobe, Arm, Intel, Microsoft and Truepic
- Standards for certifying the source and history of media content

Requires a C2PA-enabled capture device

- Content is hashed & signed to create a tamper-evident Content Credentials record
- Can include attribution information.
- Any changes (crops, additions, removals, Al mods) are recorded



Leica M11-D Leica M11-P



Canon EOS R1



Canon EOS R5 Mark II



Fuiifilm X-T50



Nikon Z6 III



Fuiifilm GFX100S II



Sony a7 IV Sony a9 III

Sony a1 II Sony a7s III



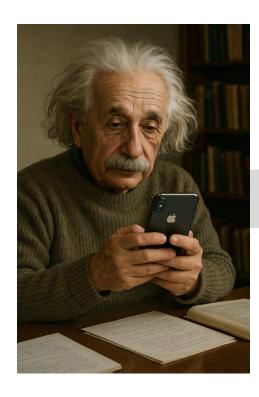
Google Pixel 10

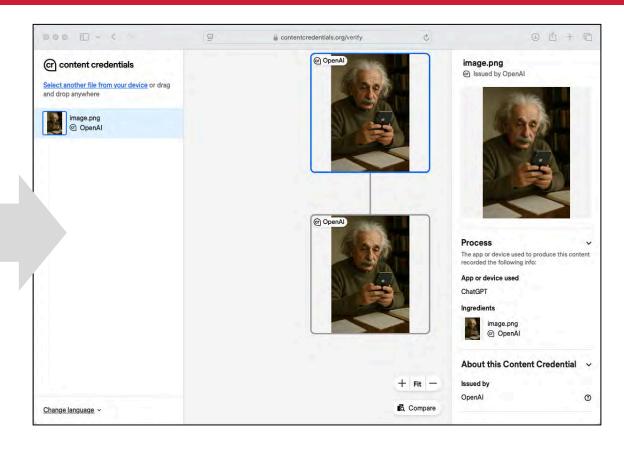


ChatGPT Bing

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https://contentcredentials.org/verify





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Statistical Steganalysis

Can we identify if content contains steganography?

Various attacks:

- Histogram (for LSB methods)
 - In natural images, histograms usually show smooth, continuous curves
 - Steganography (especially LSB embedding) can create unnatural patterns
- Chi-square test
 - LSB bits are normally not perfectly random
 - When secret data is embedded into LSBs (especially if it's random-looking encrypted data), it tends to randomize the LSB distribution
 - The chi-square test measures how far the observed distribution is from the expected one
- Machine learning: learn patterns of clean images to distinguish steganography

Payload capacity trade-offs

The more data you hide, the greater the risk of introducing detectable artifacts

New Steganography Breakthrough Enables "Perfectly Secure" Digital Communications



University of Oxford • March 7, 2023

A group of researchers has achieved a breakthrough in secure communications by developing an algorithm that conceals sensitive information so effectively that it is impossible to detect that anything has been hidden.

The team, led by the University of Oxford in close collaboration with Carnegie Mellon University, envisages that this method may soon be used widely in digital human communications, including social media and private messaging. In particular, the ability to send perfectly secure information may empower vulnerable groups, such as dissidents, investigative journalists, and humanitarian aid workers.

. . .

Despite having been studied for more than 25 years, existing steganography approaches generally have imperfect security, meaning that individuals who use these methods risk being detected. This is because previous steganography algorithms would subtly change the distribution of the innocuous content.

To overcome this, the research team used recent breakthroughs in information theory, specifically minimum entropy coupling, which allows one to join two distributions of data together such that their mutual information is maximized, but the individual distributions are preserved.

https://scitechdaily.com/new-steganography-breakthrough-enables-perfectly-secure-digital-communications/

The End