

# Shut Up 'n Hide Yer Data

Luca Caviglione

PhD Summer School  
Extreme-scale Big Data Analytics and Scientific  
Computing on Heterogeneous Platforms

Villa Grumello - Lake Como  
September 26-30, 2022



DESIGN ENVIRONMENT  
FOR EXTREME-SCALE BIG DATA ANALYTICS  
ON HETEROGENEOUS PLATFORMS



# Outline

- A Short Introduction to Information Hiding
- Why are we Here?
- Part One: Hiding Data for Offending
- Part Two: Hiding Data for Defending
- Takeaway Messages
- Conclusions



# Information Hiding

- **Information Hiding** is part of a wide spectrum of methods that are used to make secret data difficult to notice.
- **Steganography** is one of the most well-known subfields of Information Hiding.
- Steganography vs **Cryptography**:
  - Steganography: information is difficult to notice;
  - Cryptography: information is difficult to comprehend.
- Information Hiding and cryptography can be used **jointly!**

# Steganography: roots

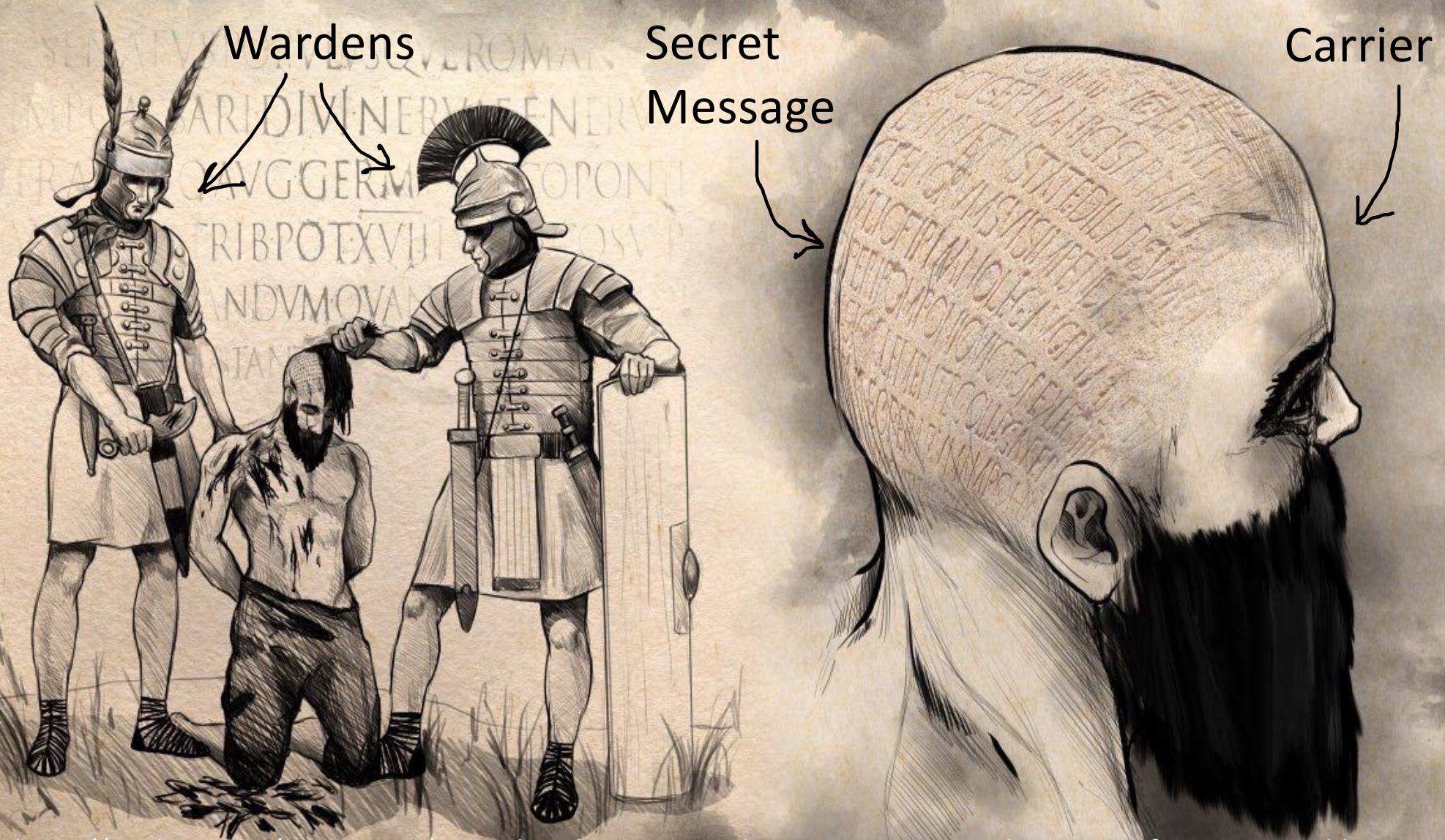
- The word steganography is the combination of:
  - *steganos* = covered, concealed;
  - *graphe* = writing.
- The first recorded use of the term:
  - in 1499 by Johannes Trithemius;
  - book “Steganographia”, i.e., an essay on cryptography and steganography.
- Mentioned in 440 BC by Herodotus in his Histories.
- **Cloak secret data into a suitable carrier.**



steganos (στεγανός) + graphe (γραφή)

# Steganography: principles

- To exchange secrets the involved parties must **agree on a pre-shared scheme**.
- The **most favourable carriers** for secret messages must have two features:
  - modifications of the carrier caused by the embedding of the secret data **should not be “visible”** to parties unaware of the steganographic procedure;
  - **they should be popular:** the used carrier should not be considered as an anomaly. The greater the carrier's popularity, the better its masking capacity.



Source: <https://medium.com/@z3roTrust/using-digital-steganography-to-protect-national-security-information-463bba664830>

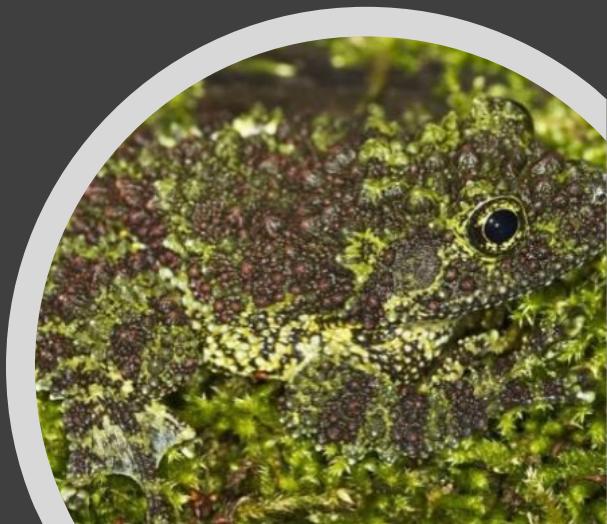


# Information Hiding in Nature

- **Philippine tarsiers** (*Tarsius syrichta*): small nocturnal primates.
- They have a high-frequency auditory sensitivity limit of approximately **91 kHz** and are also able to vocalize with a dominant frequency of **70 kHz**.
- This is an example of **ultrasonic communication**.
- Philippine tarsiers implement a private **covert communication channel** that is undetectable by predators, preys, and competitors.

# Information Hiding in Nature

- **Camouflage** exploits solutions utilizing features like the physical shape, texture, coloration, and illumination, to make animals hard to spot.
- As a result, the **information** about the exact location remains **ambiguous**.



(Conant 1958)



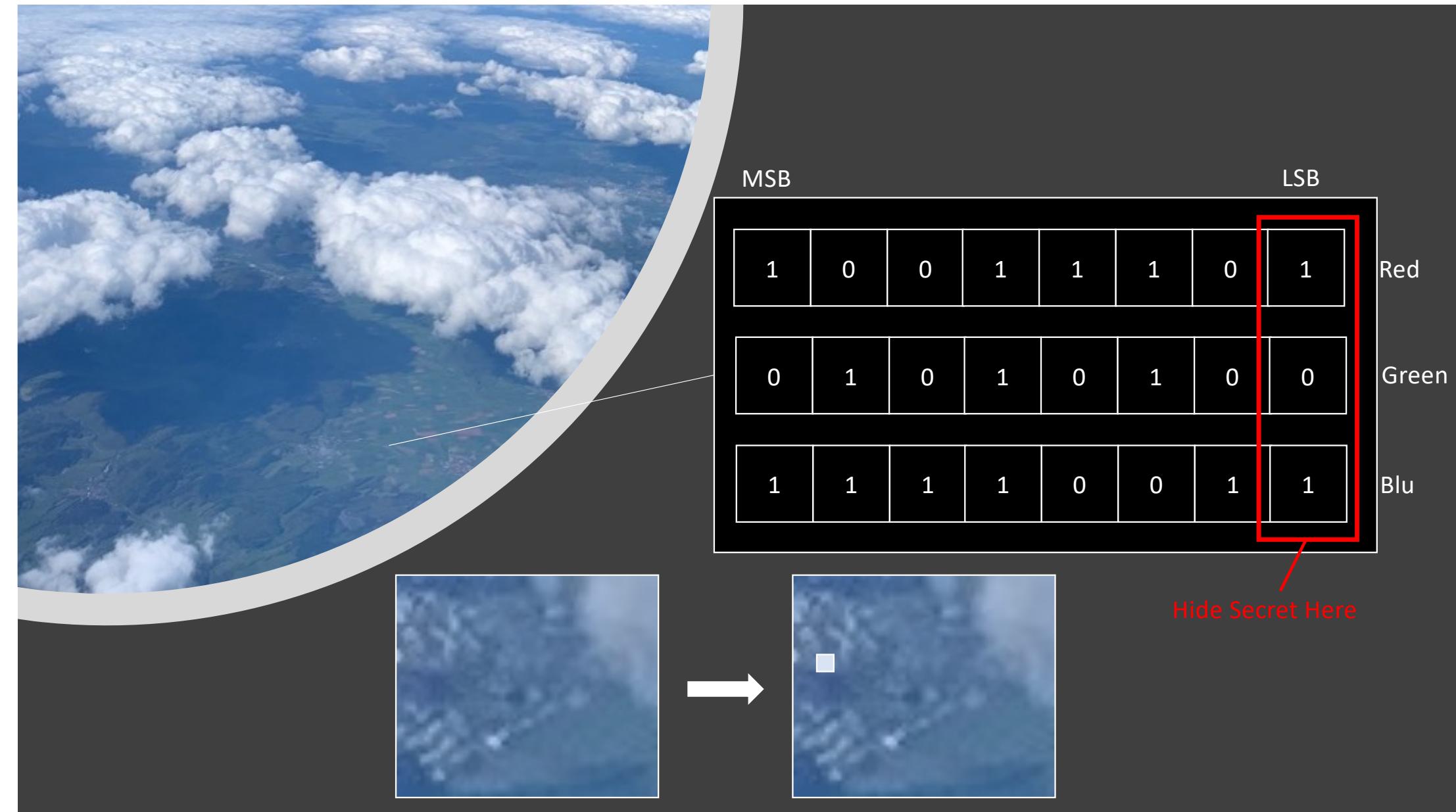
# Information Hiding in Nature

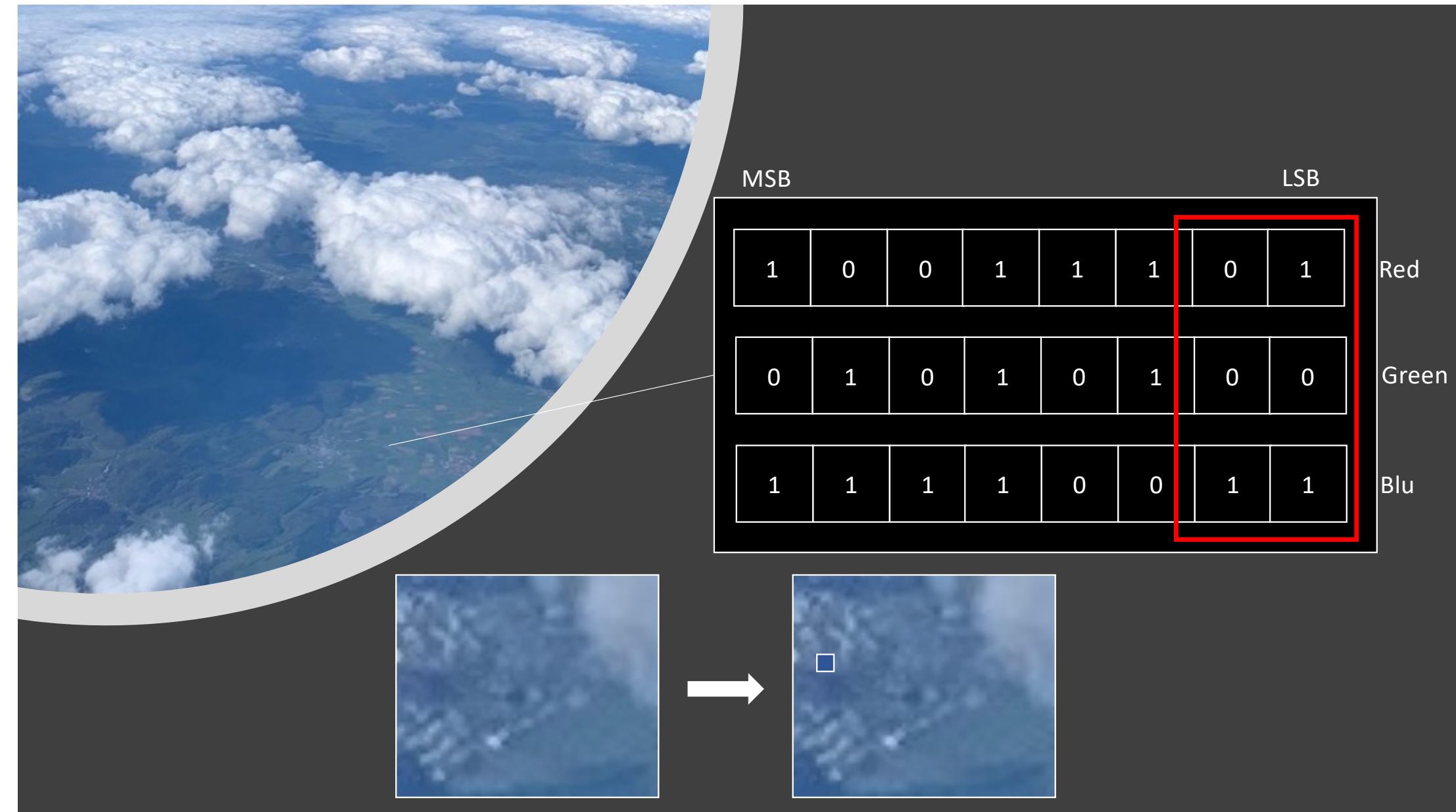
- **Mimicry** allows to obfuscate some attributes by adopting the characteristics of another living organism.
- As a result, the prey **hides** information about its own identity by impersonating something that it is not.

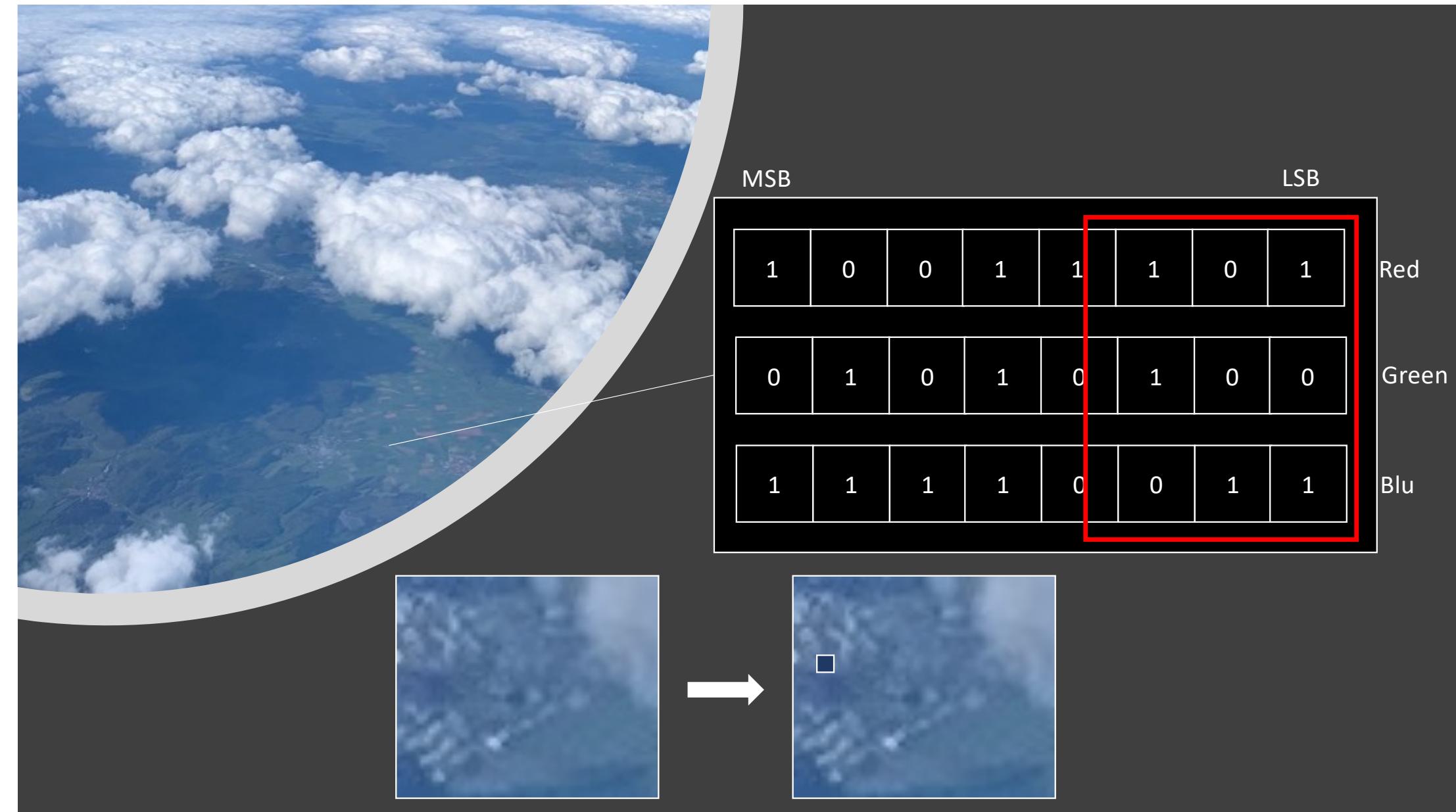
The background of the slide features a photograph taken from an airplane window, showing a vast expanse of white, fluffy clouds against a bright blue sky. Below the clouds, a patchwork of green and brown land is visible, suggesting a rural or agricultural area. A thick grey diagonal band runs from the bottom-left corner towards the top-right corner, partially obscuring the landscape.

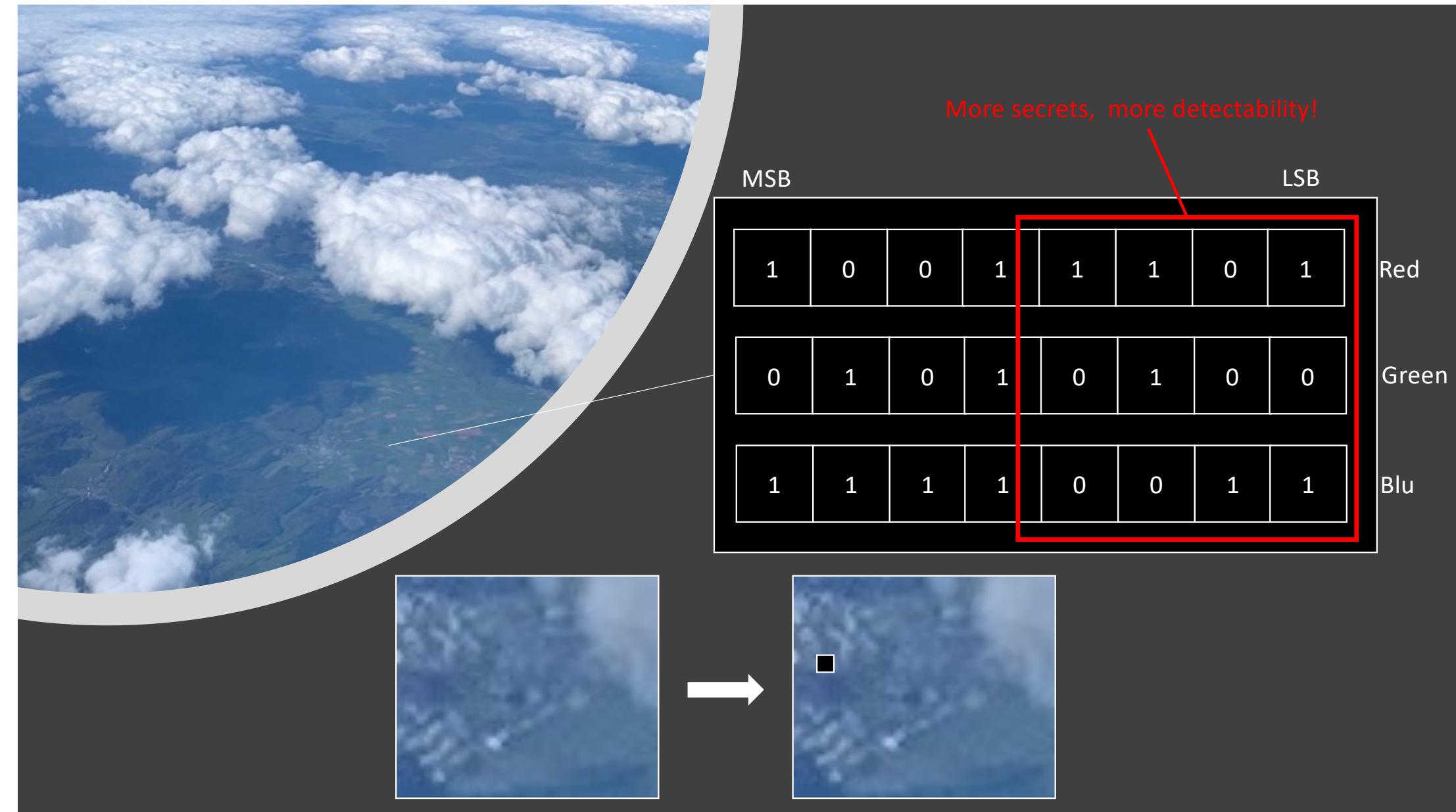
# Information Hiding in Digital Media

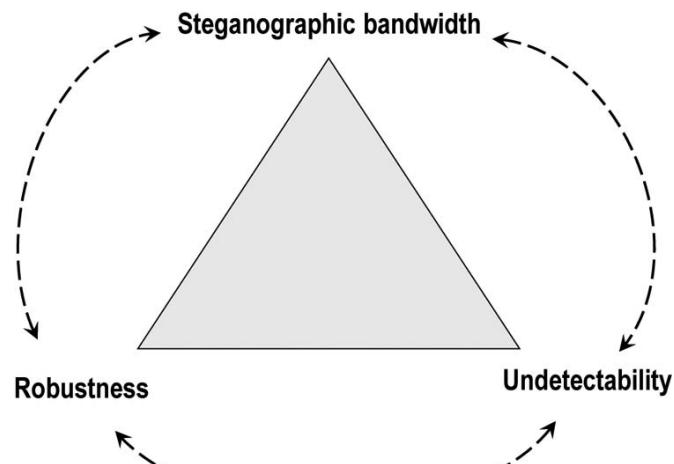
- Least Significant Bit (LSB) steganography is the simplest method for hiding data in digital media.











## The “Magic Triangle”

- **Bandwidth:** the amount of secret data that can be sent per time unit when using a particular method.
- **Undetectability:** the inability to detect secret data within a certain carrier.
- **Robustness:** the amount of alteration a carrier containing the covert data can withstand before the secret message is destroyed.

A photograph of a man with long dark hair tied back, wearing a dark suit, white shirt, and a black lanyard with a circular badge. He is holding a light-colored jacket over his left arm and looking upwards and to the side with a thoughtful expression.

# Why are we here?

- The practice of hiding data has been used through the years for:
  - military and intelligence purposes;
  - tracking the diffusion of the knowledge;
  - industrial espionage;
  - covering the sources in investigative journalism;
  - preventing censorships and avoid regimes;
  - copyright management;
  - detecting alterations in digital contents;
  - information and network traffic tracing;
  - meta-datatation;
  - malware and advanced persistent threats;
  - ...

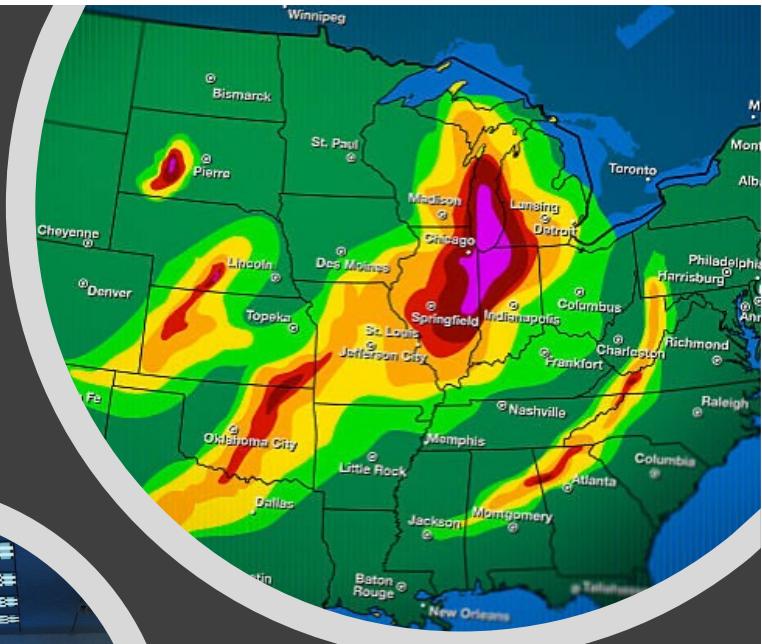
A photograph of a man with long dark hair tied back, wearing a dark suit, white shirt, and a black lanyard with a circular badge. He is holding a light-colored jacket over his left arm and looking upwards and to the side with a thoughtful expression.

# Why are we here?

- The practice of hiding data has been used through the years for:
  - military and intelligence purposes;
  - **tracking the diffusion of the knowledge;**
  - industrial espionage;
  - covering the sources in investigative journalism;
  - preventing censorships and avoid regimes;
  - **copyright management;**
  - **detecting alterations in digital contents;**
  - information and network traffic tracing;
  - meta-datation;
  - **malware and advanced persistent threats;**
  - ...

# Why are we here?

- Information Hiding is based on the following **facts**:
  - opportunity makes the thief;
  - needle in the haystack;
  - the more the burden, the more the cloaking capability;
  - social engineering and importance of applications.
- Then, the **security** of advanced, heterogenous and data-intensive applications needs a partial rethink, due to:
  - the diffusion of the “as-a-Service” paradigm;
  - industrial/economical competition;
  - artificial intelligence everywhere;
  - pervasiveness and volumes of data.
- **Increase the awareness on the topic!**





# Part One

## Hiding Data for Offending

# Some Facts About Modern Malware

- Exponential growth of malicious software.
- Despite the effort of many security experts and researchers:
  - countermeasures are progressively showing limitations;
  - only a fraction of threats is detected;
  - malware increasingly operates **undisturbed for longer timeframes**.

Malware	Discovered	Present since...
Stuxnet	06.2010	2007
Duqu	04.2011	2008
Flame	05.2012	2007
The Mask	2013	2007
Regin	2014	2003

# Some Facts About Modern Malware

- Exponential growth of malicious software.
- Despite the effort of many security experts and researchers:
  - countermeasures are progressively showing limitations;
  - only a fraction of threats is detected;
  - malware increasingly operates **undisturbed for longer timeframes**.
- How can malware developers avoid detection for long periods?

Giving an answer is **not simple!**

# Some Facts About Modern Malware

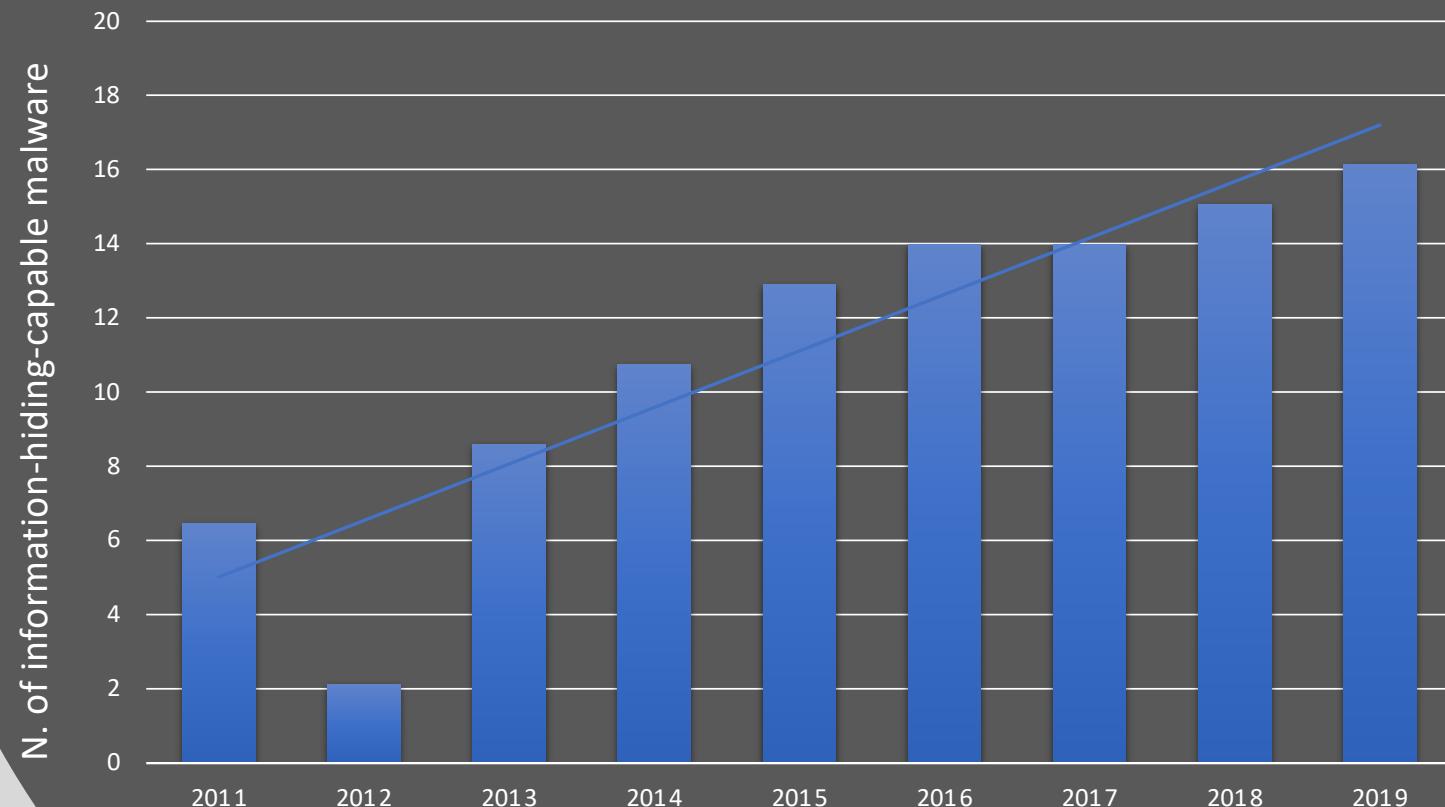
- Some possible reasons are:
  - Modular design for customization (e.g., Regin, Flamer, Weevil);
  - Multistage loading (e.g., Regin, Stuxnet, Duqu);
  - Cybercrime-as-a-Service models and Remote Access Trojans (e.g., Gh0st Rat);
  - **Information Hiding** techniques and **steganography** (e.g., Platinum APT).



## Main Attack Purposes

- Information Hiding techniques have been **increasingly observed** in malicious software, for instance to:
  - elude detection;
  - covertly spread an infection or orchestrate attacks;
  - exfiltrate sensitive data;
  - bypass sandboxing mechanisms;
  - implement covert channels;
  - ...

# A Constant Trend



Data collected by members of Criminal Use of Information Hiding initiative (CUING): cuing.org and cuing.eu

# A Constant Trend

The impact of information-hiding-capable malware is heavily underestimated: security experts often do not correctly recognize and classify the used techniques

# The Root of the Trend

- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.

# The Root of the Trend

- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.
- Three attack stages:
  - Stage 1: phishing!

# The Root of the Trend

- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.
- Three attack stages:
  - Stage 1: phishing!
  - Stage 2: the trojan attempts to retrieve data from remote sources;

[www.comto\[SANITIZED\].com/wak/mansher0.gif](http://www.comto[SANITIZED].com/wak/mansher0.gif)

[www.kay\[SANITIZED\].net/images/btn\\_topsec.jpg](http://www.kay[SANITIZED].net/images/btn_topsec.jpg)

[www.swim\[SANITIZED\].net/images/sleepyboo.jpg](http://www.swim[SANITIZED].net/images/sleepyboo.jpg)

[www.comto\[SANITIZED\].com/Tech/Lesson15.htm](http://www.comto[SANITIZED].com/Tech/Lesson15.htm)

# The Root of the Trend

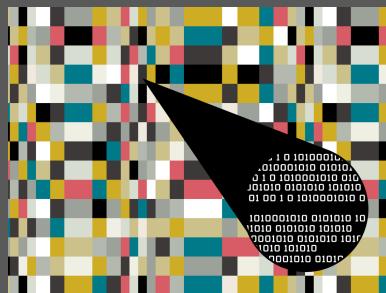
- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.
- Three attack stages:
  - Stage 1: phishing!
  - Stage 2: the trojan attempts to retrieve data from remote sources;

```
<!-- { 685DEC108DA731F1} -->
<!-- { 685DEC108DA73CF1} -->
<!-- { eqNBb-Ou07WM} -->
<!-- { eqNBb-Ou07iM} -->
<!-- { eqNBb-Ou01OMOO++} -->
<!-- { eqNBb-Ou11O+} -->
<!-- { eqNBb-Ou2Ra+} -->
<!-- { uGu~iWAl,Q(iNyn'/) -->
<!-- { ujQ~iY,UnQ[ !,hboZNg} -->
<!-- { ujQ~iY,UnQ[ !,hmoZNg} -->
<!-- { ujQ~iY,UnQ[ !,hvoZNg} -->
```

Commands hidden in HTML comments  
(encrypted + base64 encoded)

# The Root of the Trend

- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.
- Three attack stages:
  - Stage 1: phishing!
  - Stage 2: the trojan attempts to retrieve data from remote sources;



Commands hidden in images via  
steganographic techniques

# The Root of the Trend

- Probably, Trojan.Downbot (circa 2006, Operation Shady RAT)
- The trojan created a back door and:
  - downloaded files appearing as real HTML pages or JPEG images;
  - hidden data contained commands for remote servers.
- Three attack stages:
  - Stage 1: phishing!
  - Stage 2: the trojan attempts to retrieve data from remote sources;
  - Stage 3: the trojan connects to a host and sets up a remote shell waiting for commands.



# Stegomalware

- Many researchers are starting to identify this class of threats as:
  - **Stegomalware:** steganographic malware;
  - “borrowed” from works on mobile security and covert social botnets.
- A possible (common) definition:
  - **Stegomalware is a malware using some form of steganography to remain undetected.**
- Personally, I found it:
  - a bit ambiguous (Information Hiding vs steganography);
  - it is not only about detection (e.g., “colluding applications”) so it narrows the scope too much.

G. Suarez-Tangil, J. Tapiador, P. Peris-Lopez, “Stegomalware: Playing Hide and Seek with Malicious Components in Smartphone Apps”, 10<sup>th</sup> International Conference on Information Security and Cryptology, pp. 496–515, 2014.

S. Nagaraja, A. Houmansadr, P. Piyawongwisal, V. Singh, P. Agarwal, B. Nikita, “Stegobot: A Covert Social Network Botnet”, Information Hiding - 13<sup>th</sup> International Conference, pp. 299 – 313, 2011.



## Stegomalware

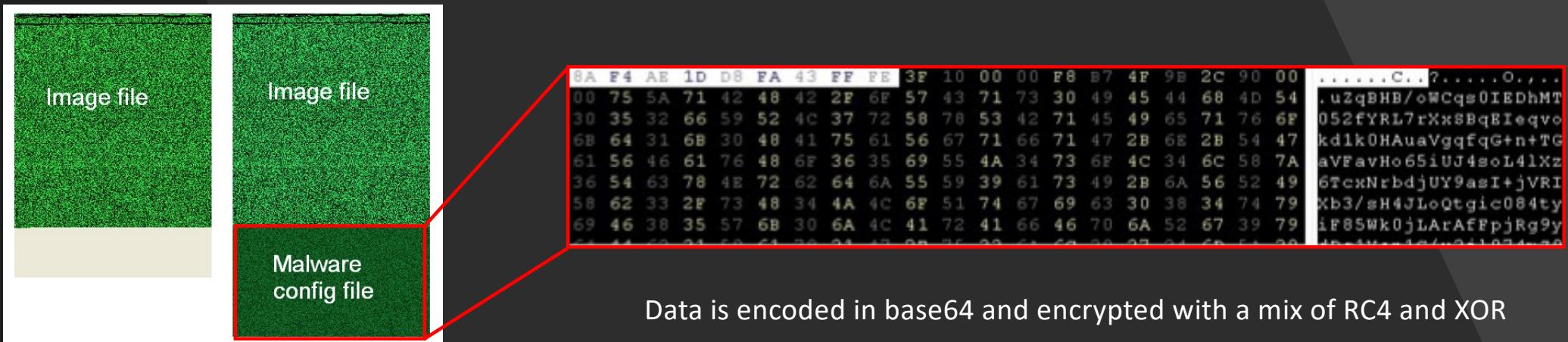
- Attacks observed in the wild tend to hide data in a limited number of places.
- Three main groups:
  - **Group 1:** malware hiding information by modulating the status of shared hardware/software resources (8%);
  - **Group 2:** malware injecting secret data into network traffic (32%);
  - **Group 3:** malware embedding secret data by modifying a digital file structure or by using digital media steganography (60%).



## Example: ZeusVM

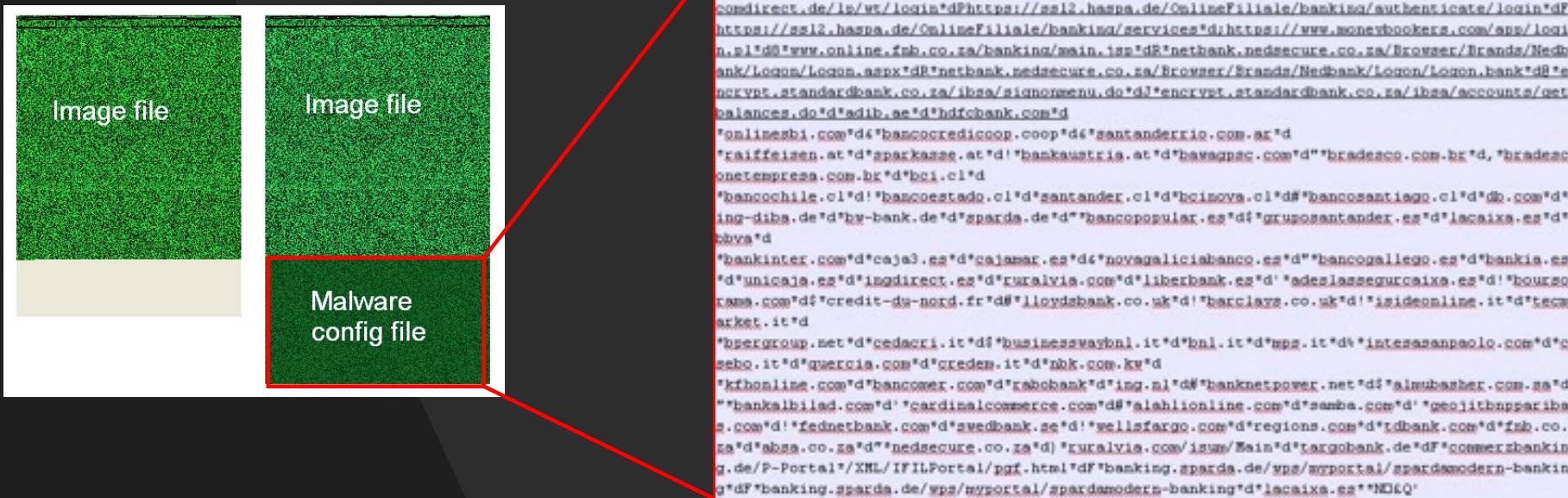
- Discovered in 2014, it is an evolution of the Zeus/Zbot malware.
- A variant has been also used in the Hammertoss APT isolated in 2015.
- Attack phases:
  - the malware downloads an innocent JPG from a C&C server;
  - the image perfectly works but a configuration file is appended;

# Example: ZeusVM



Source: <https://blog.malwarebytes.com/threat-analysis/2014/02/hiding-in-plain-sight-a-story-about-a-sneaky-banking-trojan/>

# Example: ZeusVM



Source: <https://blog.malwarebytes.com/threat-analysis/2014/02/hiding-in-plain-sight-a-story-about-a-sneaky-banking-trojan/>



## Example: ZeusVM

- Discovered in 2014, it is an evolution of the Zeus/Zbot malware.
- A variant has been also used in the Hammertoss APT isolated in 2015.
- Attack phases:
  - the malware downloads an innocent JPG from a C&C server;
  - the image perfectly works but a configuration file is appended;
  - trojan activates when traffic towards financial institutions provided in the configuration file is sensed;
  - it steals user credentials by acting in a MitM fashion.

Source: <https://blog.malwarebytes.com/threat-analysis/2014/02/hiding-in-plain-sight-a-story-about-a-sneaky-banking-trojan/>



## Example: Invoke-PSImage

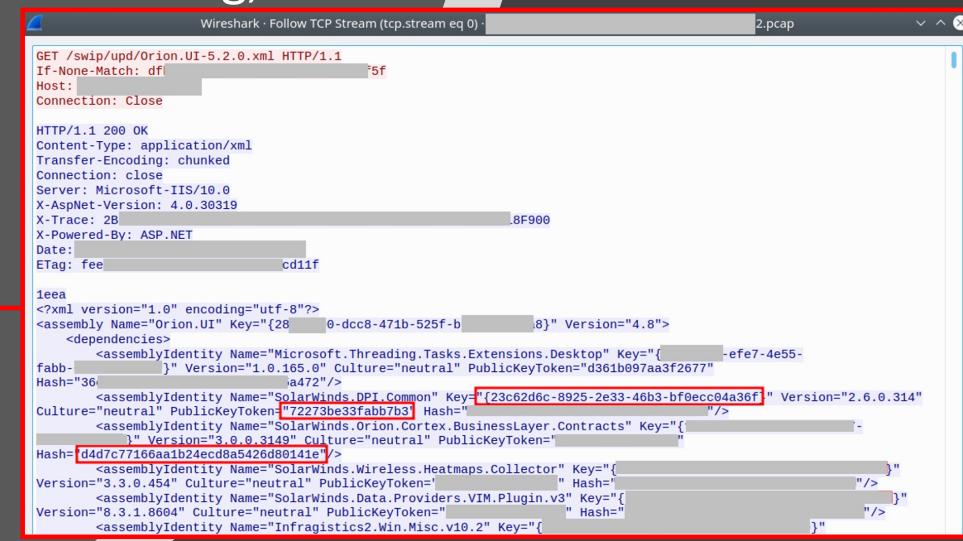
- Invoke-PSImage is a tool for encoding a PowerShell Script in pixels of a PNG image.
- It uses LSB steganography.
- Invoke-PSImage has been released in Dec. 2017 and it has been used for a malware campaign just 1 week later.
- Phases observed in the Ursnif/INPS campaign:
  - infected Excel is used to launch a malicious VB macro;
  - the macro downloads an image containing a PowerShell script;
  - the script is extracted and launched to retrieve the Ursnif loader.

Invoke-PSImage: <https://github.com/peewpw/Invoke-PSImage>

# Example: Sunburst

- Sunburst is a trojanized version of the Orion plugin (Solarwind).
- It targets HTTP traffic.
- Attack Phases:
  - various checks to understand if an analysis tool is running;
  - ... (including, opening a backdoor);
  - creates a hidden C&C channel in HTTP.

Sunburst uses HTTP GET or POST requests. The server hides data within HTTP response bodies mimicking benign XML/.NET files. Hidden data is spread across many IDs and strings and extracted via the `\{{0-9a-f}\}{36}\}|"/"[0-9a-f]{32}"/"[0-9a-f]{16}` regexp.



```
GET /swip/upd/Orion.UI-5.2.0.xml HTTP/1.1
If-None-Match: d1f5f
Host:
Connection: Close

HTTP/1.1 200 OK
Content-Type: application/xml
Transfer-Encoding: chunked
Connection: close
Server: Microsoft-IIS/10.0
X-AspNet-Version: 4.0.30319
X-Trace: 2B .BF900
X-Powered-By: ASP.NET
Date: [REDACTED]
ETag: fee cd11f

1fea
<?xml version="1.0" encoding="utf-8"?>
<assembly Name="Orion.UI" Key="{28 [REDACTED] -dccb8-471b-525f-b [REDACTED] 8}" Version="4.8">
  <dependencies>
    <assemblyIdentity Name="Microsoft.Threading.Tasks.Extensions/Desktop" Key="{}-efe7-4e55-[REDACTED] fabb-[REDACTED]" Version="1.0.165.0" Culture="neutral" PublicKeyToken="d361b097aa3f2677" Hash="36[a472]" />
    <assemblyIdentity Name="SolarWinds.DPI_Common" Key="{}{23c62d6c-8925-2e33-46b3-bf0ecc04a36f" Version="2.6.0.314" Culture="neutral" PublicKeyToken="72273be33fabbb7b3" Hash="{}" />
    <assemblyIdentity Name="SolarWinds.Orion.Cortex.BusinessLayer.Contracts" Key="{}-[REDACTED]" Version="3.0.0.3149" Culture="neutral" PublicKeyToken="{}" Hash="{}" />
    <assemblyIdentity Name="SolarWinds.Wireless.Heatmaps.Collector" Key="{}-[REDACTED]" Version="3.3.0.454" Culture="neutral" PublicKeyToken="{}" Hash="{}" />
    <assemblyIdentity Name="SolarWinds.Data.Providers.VIM.Plugin.v3" Key="{}-[REDACTED]" Version="8.3.1.8604" Culture="neutral" PublicKeyToken="{}" Hash="{}" />
    <assemblyIdentity Name="Infragistics2.Win.Misc.v10.2" Key="{}-[REDACTED]" />
  </dependencies>
</assembly>
```

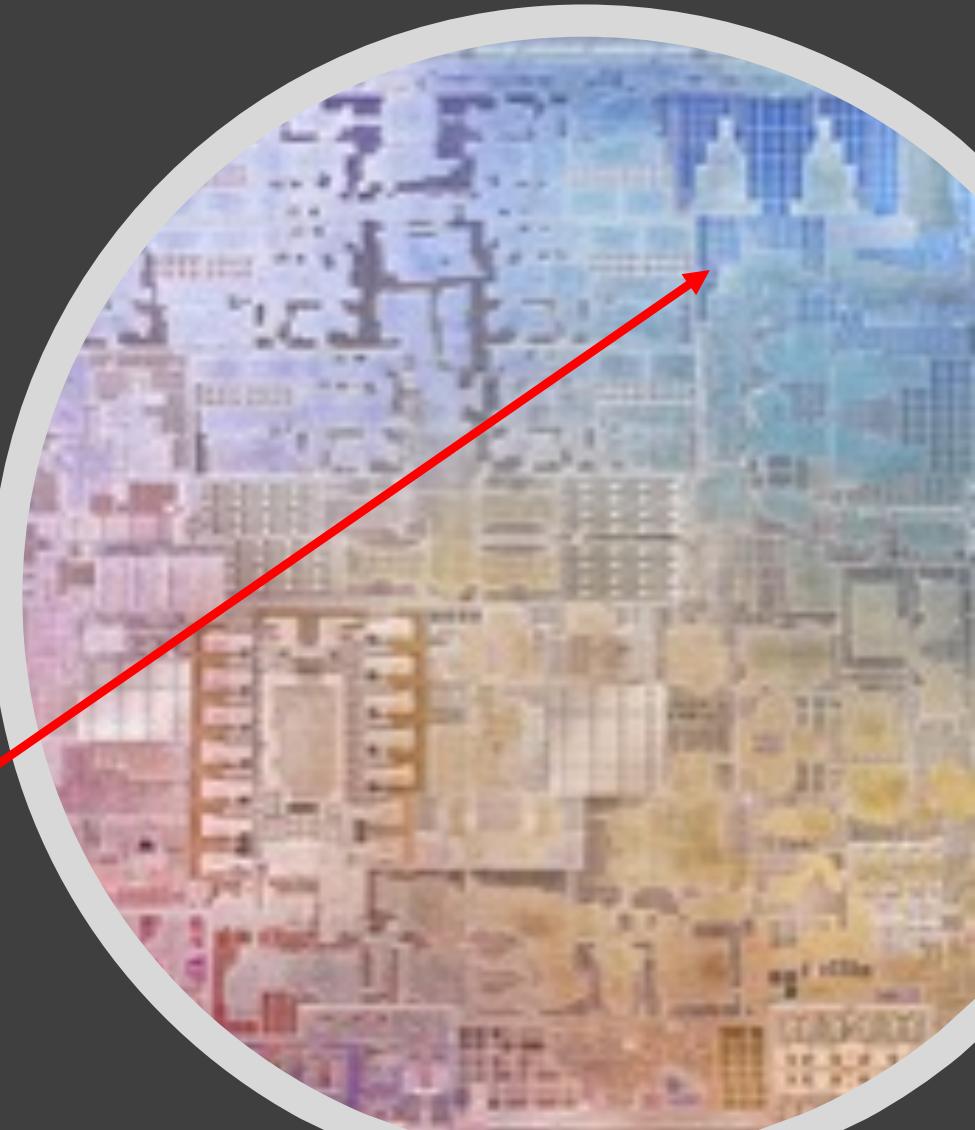


# Hiding Everywhere!

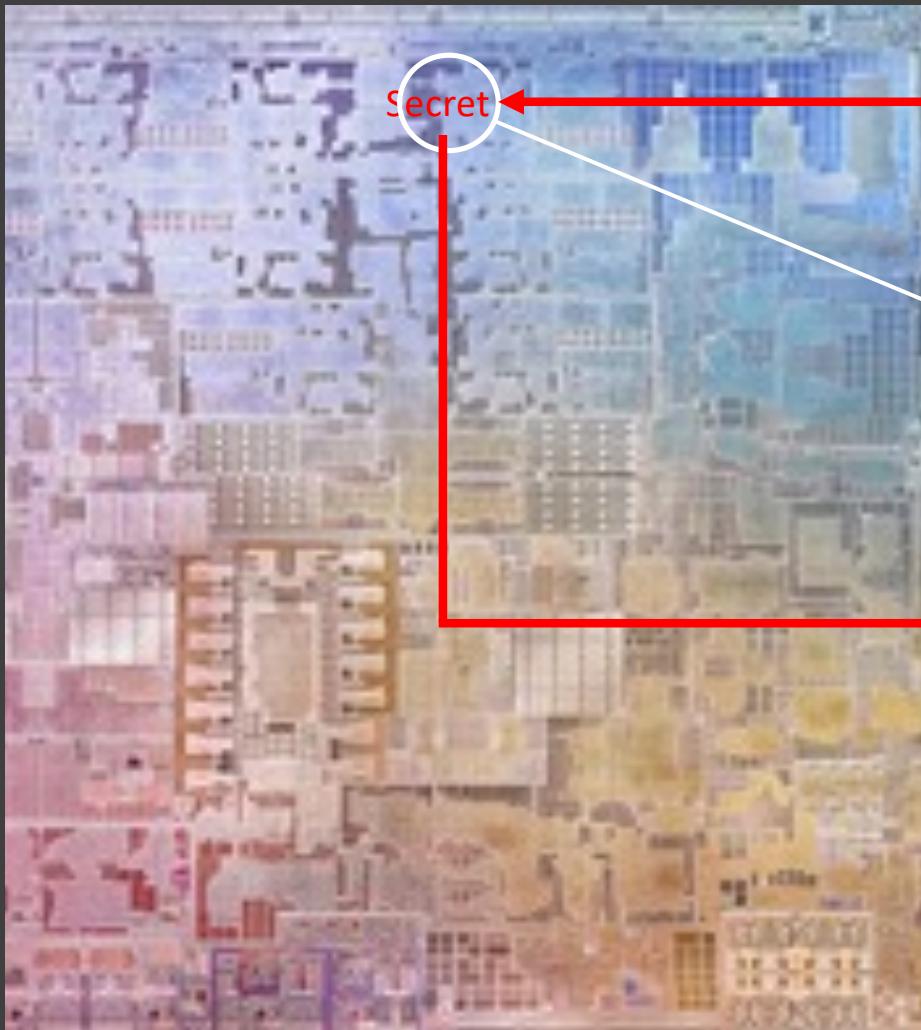
- Malicious actors proven to be very smart.
- Data can be hidden everywhere!

Malware hidden in images from the James Webb telescope: a malicious executable is hidden in a picture of the the galaxy cluster SMACS 0723. To prevent detection, the cloaked Golang executable is XORed and strings are encoded in ROT25.

# Hiding Everywhere!



EL0 (Exception Level) User Applications



ARM System Register: its original purpose is unknown, but probably not to be made accessible to EL0 intentionally.





## Part Two

# Hiding Data for Defending

# Why Watermarking?

- Watermarking is a popular application of data hiding.
- A **watermark** can be used for:
  - Copyright protection;
  - Fingerprinting and tracking;
  - Integrity;
  - Metadata-tion.
- It can be applied to a variety of digital artifacts, e.g.:
  - Digital media (audio and video);
  - Pictures;
  - Maps/Medical data;
  - 3D meshes;
  - Network traffic;
  - ...



Digital



Digital/Analog



Analog/Digital



Digital



Digital/Analog



Analog/Digital

# Why Watermarking?

- The main idea is to hide data in contents to:
  - Track their use (diffusion);
  - Recognize tampering and manipulations;
  - Enforce copyright;
  - ...



Digital



Digital/Analog



Analog/Digital



Digital



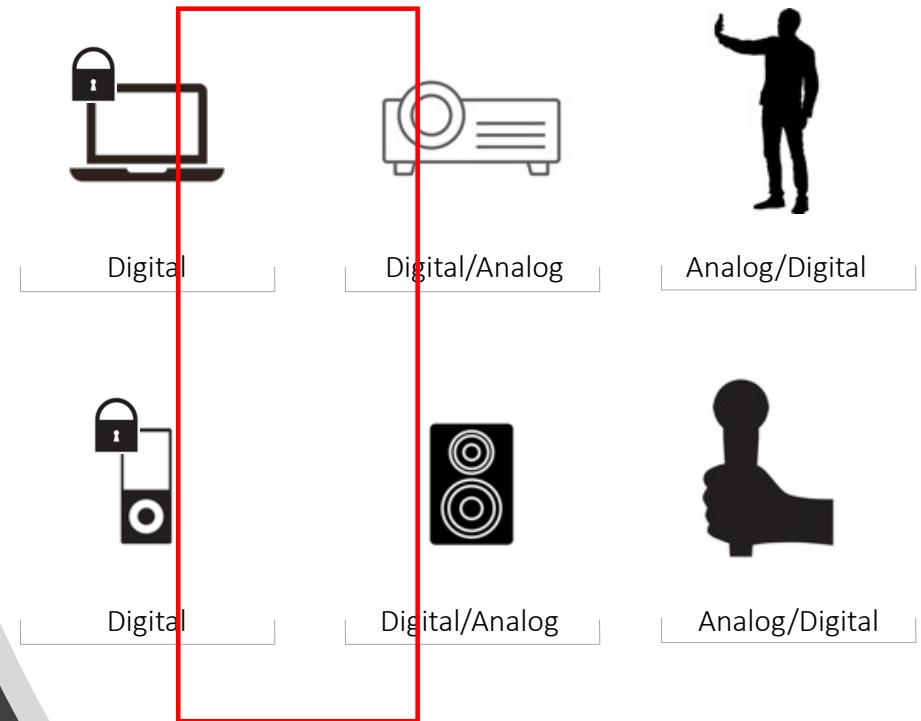
Digital/Analog



Analog/Digital

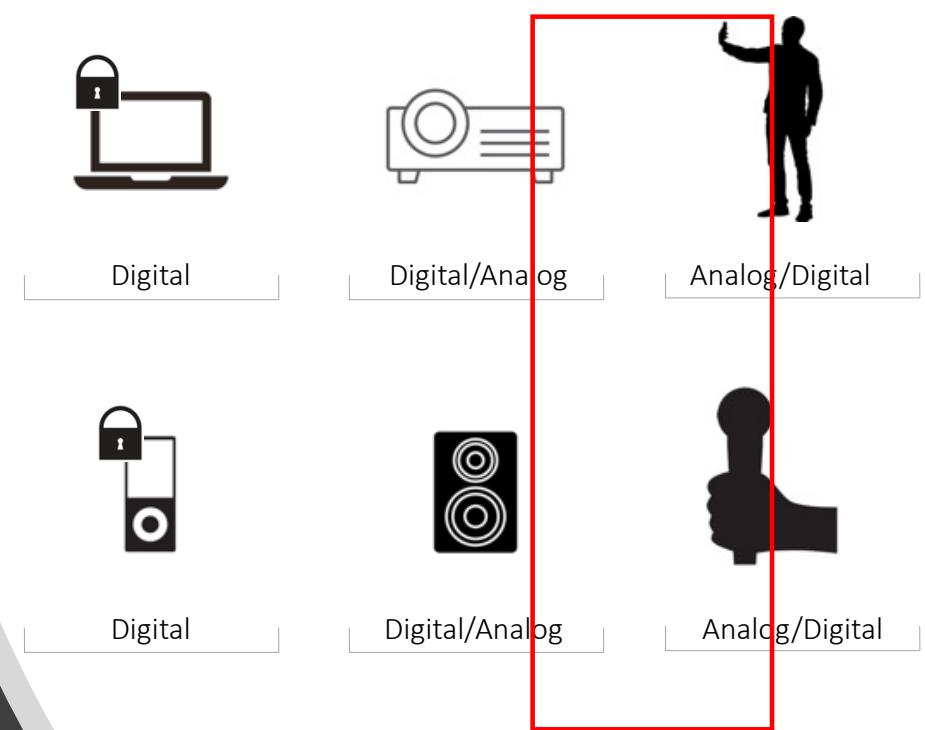
# Why Watermarking?

- The main idea is to hide data in contents to:
  - Track their use (diffusion);
  - Recognize tampering and manipulations;
  - Enforce copyright;
  - ...
- Main applications:
  - Digital Right Management (DRM) in media and digital contents;



# Why Watermarking?

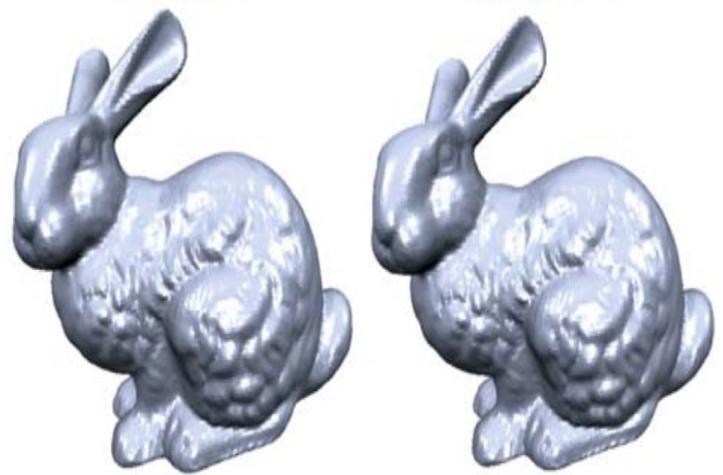
- The main idea is to hide data in contents to:
  - Track their use (diffusion);
  - Recognize tampering and manipulations;
  - Enforce copyright;
  - ...
- Main applications:
  - Digital Right Management (DRM) in media and digital contents;
  - Elimination of the “Analog Hole”.





“Screener” – Copyright and Tracking

# Example



3D Mesh – Copyright and 3D printing management

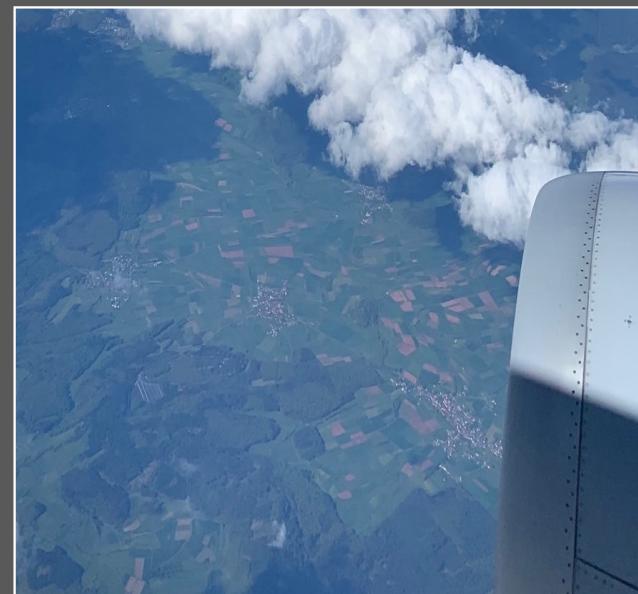
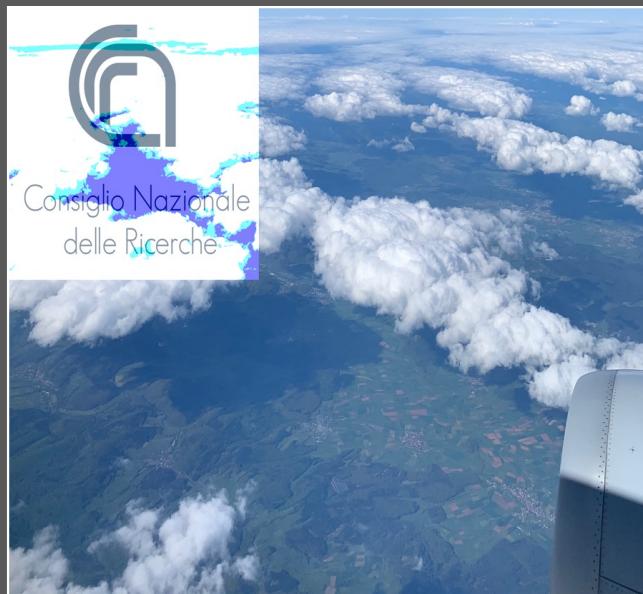
## Example

Source: J. Wu, L. Kobbelt, "Efficient spectral watermarking of large meshes with orthogonal basis functions", Visual Computing.

# Types of watermarks

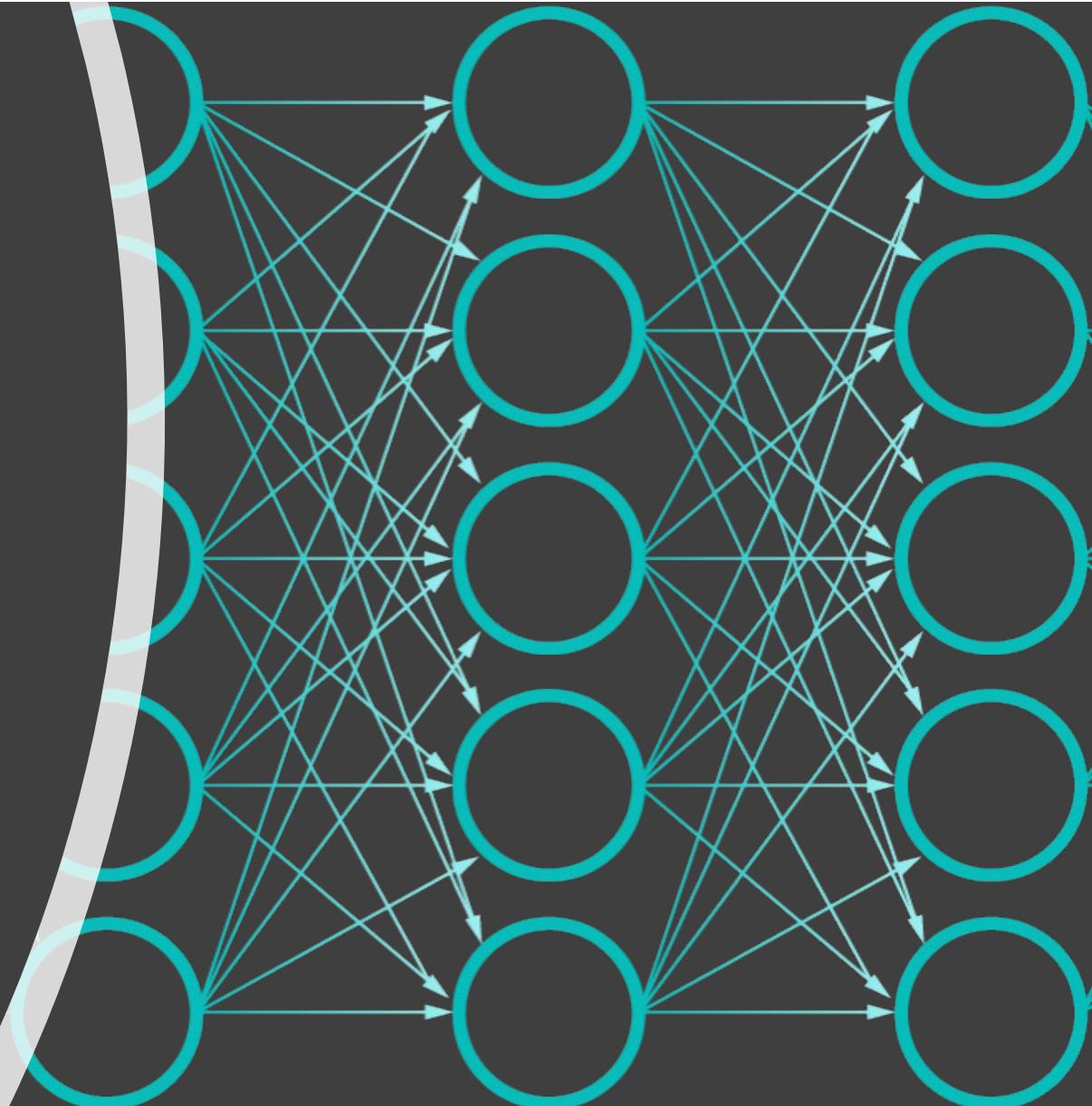
- Alas, there is **not** a **comprehensive** watermarking scheme.
- In general, there are **two** types of watermarking techniques:
  - **robust**: detectable after a wide range of attacks, it is mainly used for copyright and tracking;
  - **fragile**: typically used for authentication and localization of modifications made to the original digital media.
- Other possible types are:
  - **perceptible**: detectable by human senses and typically used to display copyright notices and to identify public documents;
  - **imperceptible**: not visible by human senses;
  - **non-invertible**: preventing the possibility of removing the watermark, recovering the original document, and applying new data.

# Attack Example: Cropping



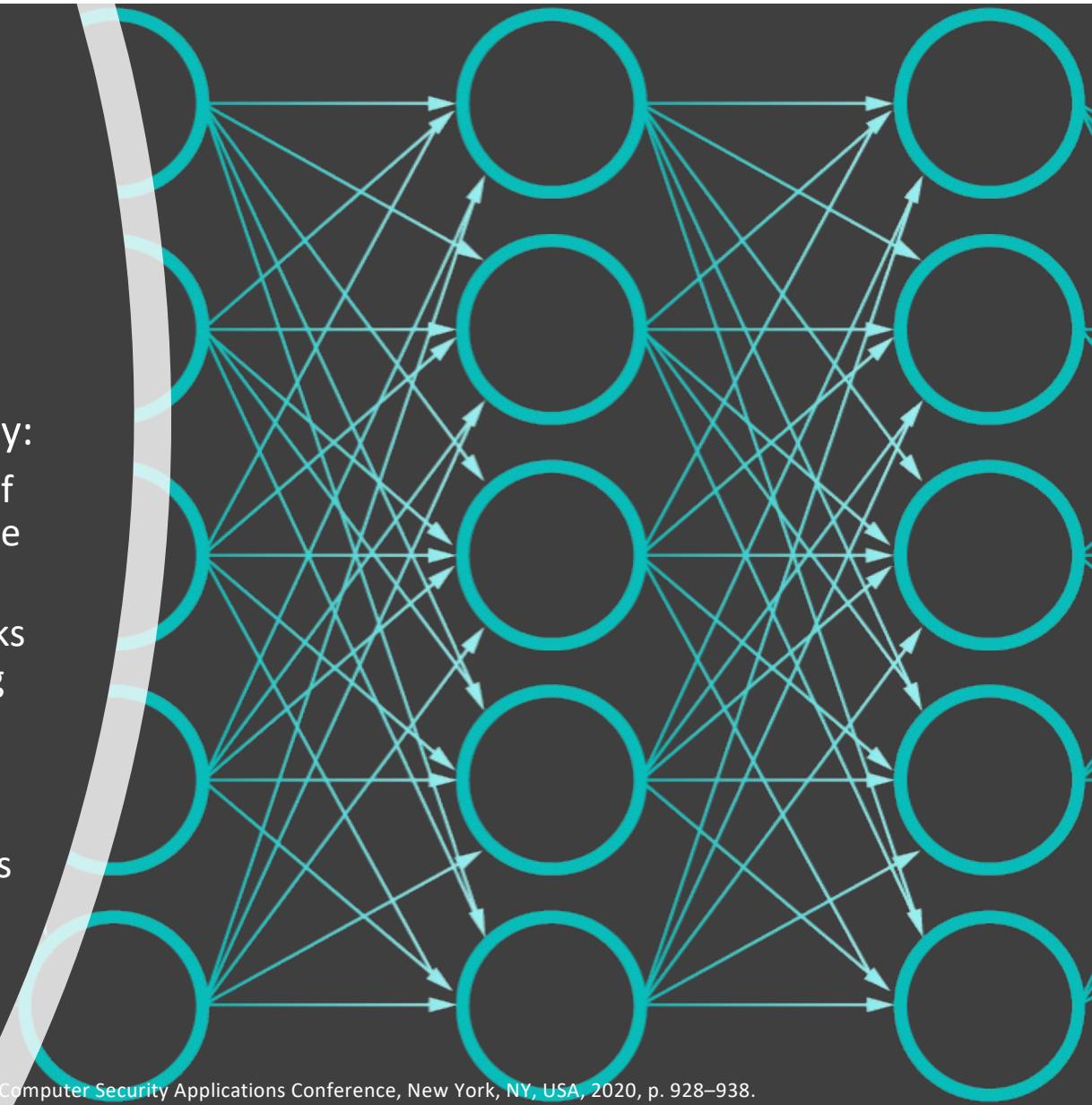
# AI Watermarking

- In 2021, the industry of machine learning had a value of 15.5 billions of USD.
- Some important drivers:
  - AI-as-a-Service and ML-as-a-Service;
  - IP protection;
  - tracking unfair usages;
  - protection against new attacks.
- Typical defensive approaches are in computer/network security.
- Information Hiding could play a role!



# AI Watermarking

- To track a model, a payload can be hidden by:
  - classical **LSB approaches** (i.e., the last bits of each model parameter are altered to encode arbitrary data);
  - exploiting **resilience** of deep neural networks and introduce internal errors by overwriting the model with secret data and do not re-train the resulting “broken neurons”;
  - **mapping** techniques, i.e., arbitrary information is placed by altering parameters with same or closest values.



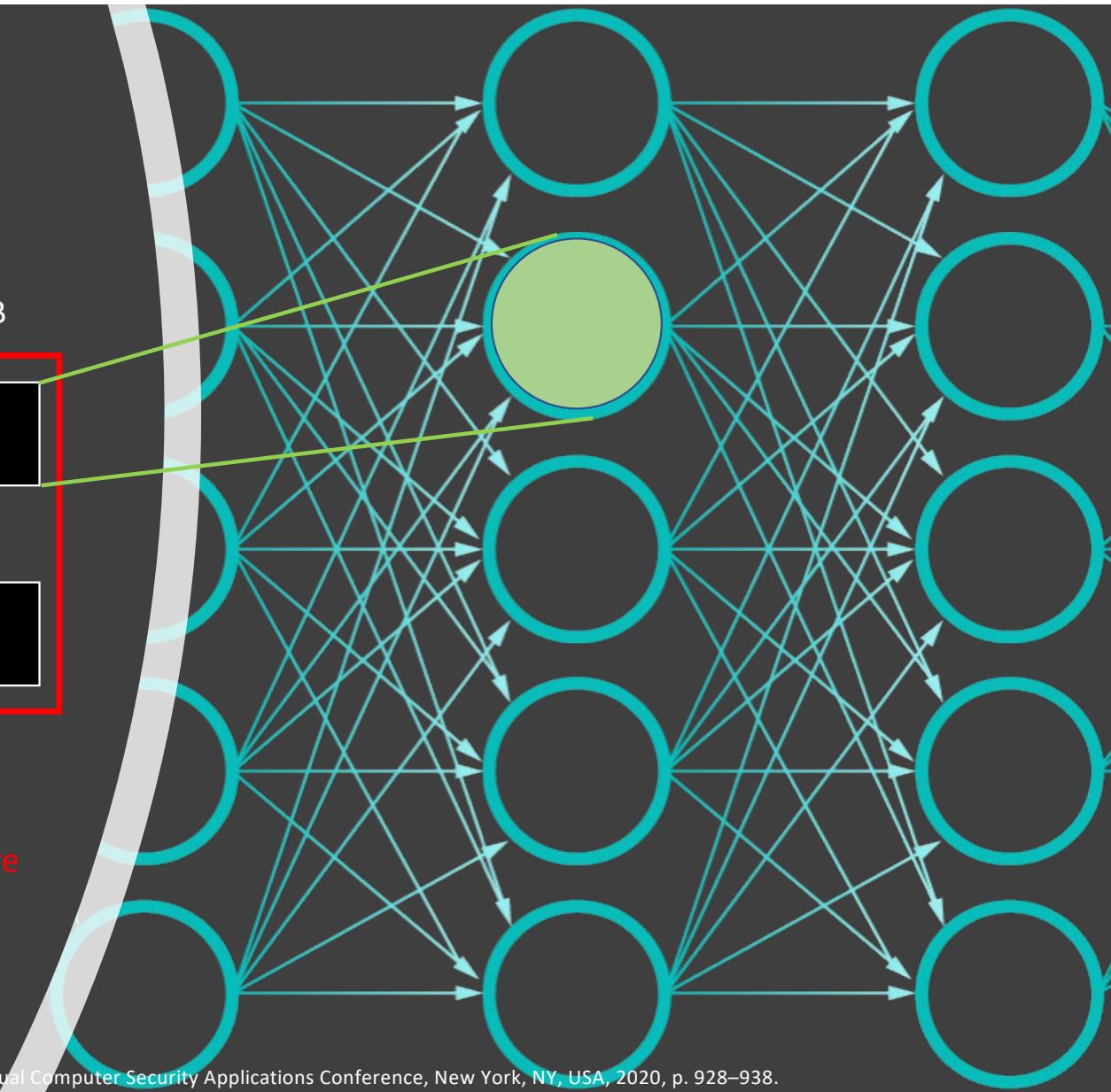
MSB

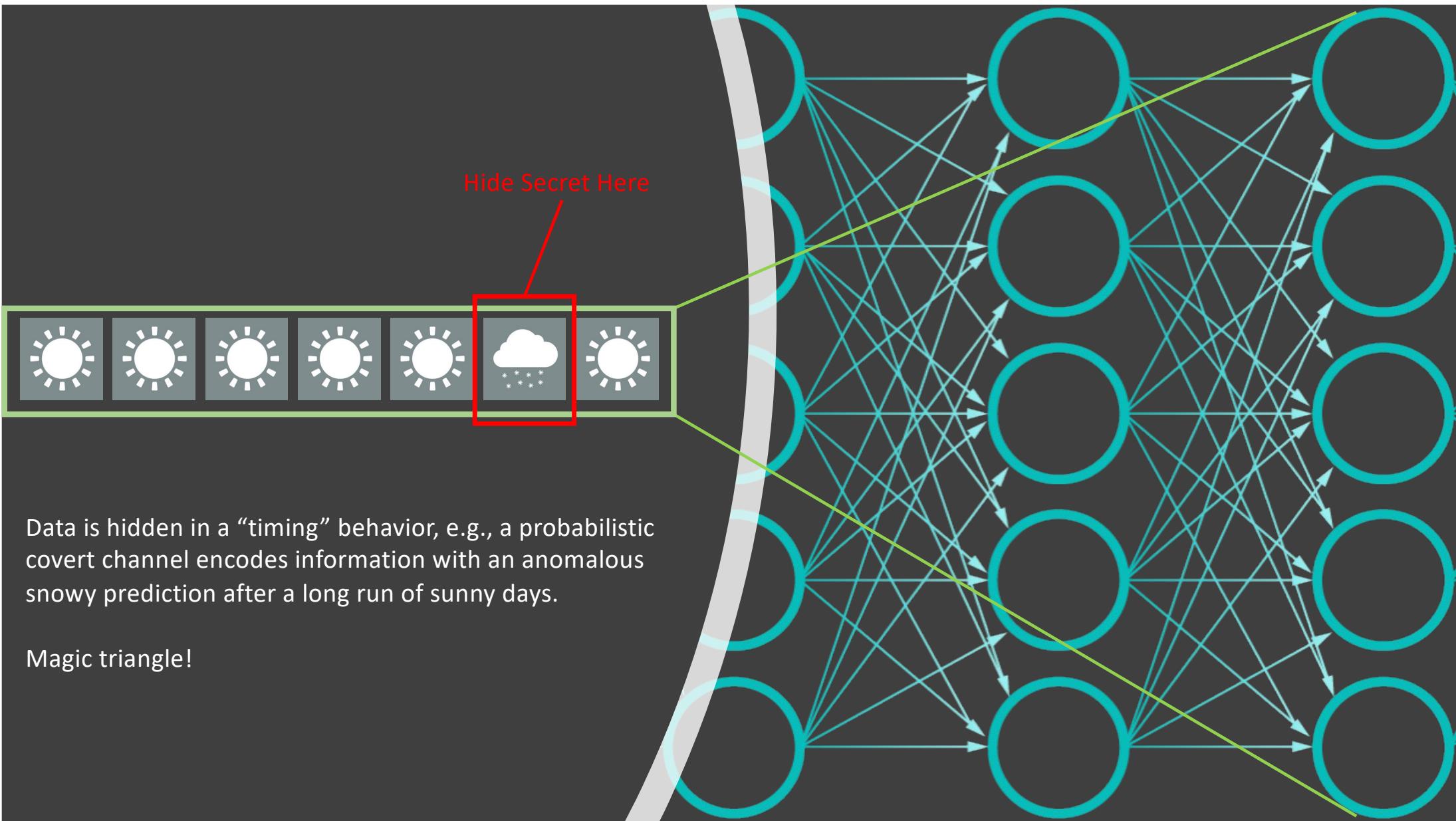
1	0	0	1	1	1	0	1
---	---	---	---	---	---	---	---

LSB

1	0	0	1	1	1	0	0
---	---	---	---	---	---	---	---

Hide Secret Here





# Software Obfuscation

- Software protection, e.g., to make reverse engineering attempts harder, usually exploits **code obfuscation**.
- Information Hiding can be a valuable tool, too.
- The “colluding applications” scheme can be used to implement timing or probabilistic channels for obfuscating the code as well as for enforcing specific execution behaviors.

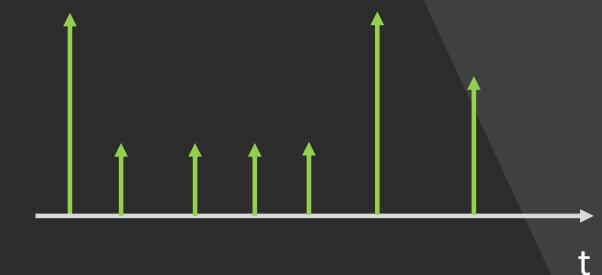
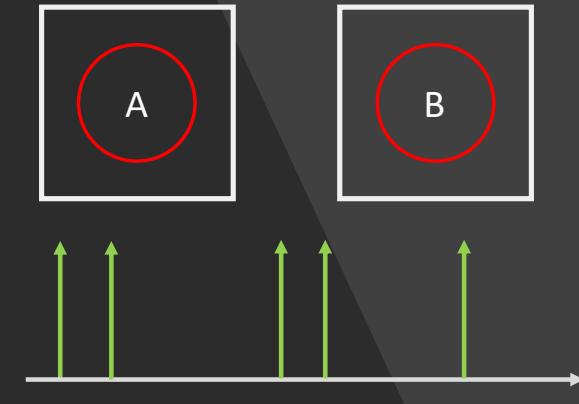
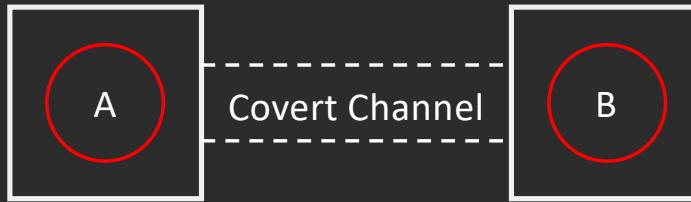
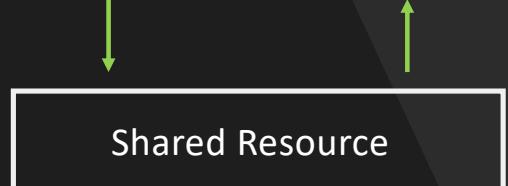
```
void P() {  
    int a = b;  
}
```

```
void P() {  
    int i,a = 0;  
    for(i=0;i<b;i++) {  
        a++;  
    }  
}
```

# Software Obfuscation

Process/Thread/Application

Execution Enclave  
(Sandbox, VM, etc.)





## Takeaway Message N.1

Information Hiding is a double-edged sword: fear it or use it.



FRANK ZAPPA  
*and The*  
MOTHERS OF INVENTION  
ONE SIZE FITS ALL

## Takeaway Message N.2

There is not a unique hiding strategy and there is not a general defensive methodology.



## Takeaway Message N.3

Scientific computing and manipulation of large-scale data are appealing for attackers and have many societal implications (e.g., climate change). Do not underestimate your attractiveness.



# Conclusions

- Information Hiding is a double-edged sword that can be used for:
  - **attack**, for instance to conceal malicious payloads or create covert channels;
  - **defense**, for instance to watermark or protect AI models or software.
- The embedding process, attacks, applications, and countermeasures are tightly-coupled with the specific tasks:
  - no one-size-fits-all mechanisms!
- Hiding data can be done (almost) against **any media or digital object** and in an **unbounded** numbers of **scenarios**.



Thank You!  
Questions?

Twitter: @lucacaviglione

email: luca.caviglione@cnr.it

# The Canary Trap!

## Why Watermarking?

- The main idea is to hide data in contents to:
  - Track their use (diffusion);
  - Recognize tampering and manipulations;
  - Enforce copyright;
  - ...
- **Main applications:**
  - Digital Right Management (DRM) in media and digital contents;
  - Elimination of the “Analog Hole”.

