



# Disinformation Detection: Deepfakes, Spoofing, and Forgeries in Scientific Publications

**Prof. Anderson Rocha**

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**Unicamp Professor for** 15+ years  
Expert in **Artificial Intelligence** and **Complex Data** (23+ years)  
Research in both theoretical and applied aspects of Artificial Intelligence

**Reasoning for Complex Data (Recod.ai)** Lab. Coordinator  
> Recod.ai counts with ~350 collaborators worldwide  
> One of the largest and most productive in Latin America (LATAM)

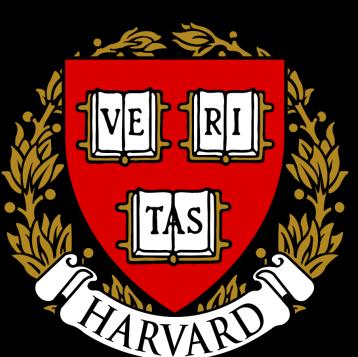


Tag me

**IEEE Fellow**  
**IEEE Biometrics Council Distinguished Lecturer**  
Microsoft, Google e Tan-Chin Tuan Foundation **Fellow**  
Asia Pacific Association AI Fellow

Listed among the **TOP-2% Scientists** worldwide (According to Stanford/PlosOne Study)

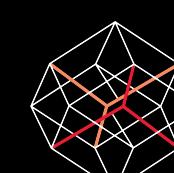
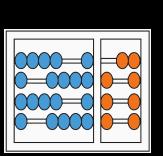
**Visiting Professor** to multiple institutions over the years



**UNIVERSITÉ DE  
MONTPELLIER**



**Université  
de BORDEAUX**



**recod.ai**  
reasoning for complex data

# Synthetic Reality

AI-driven synthetic media

Context

Narratives

# Number of AI-Created Images\*

EVERYPIXEL

DALL-E 2

**916 million**

Models based on Stable Diffusion

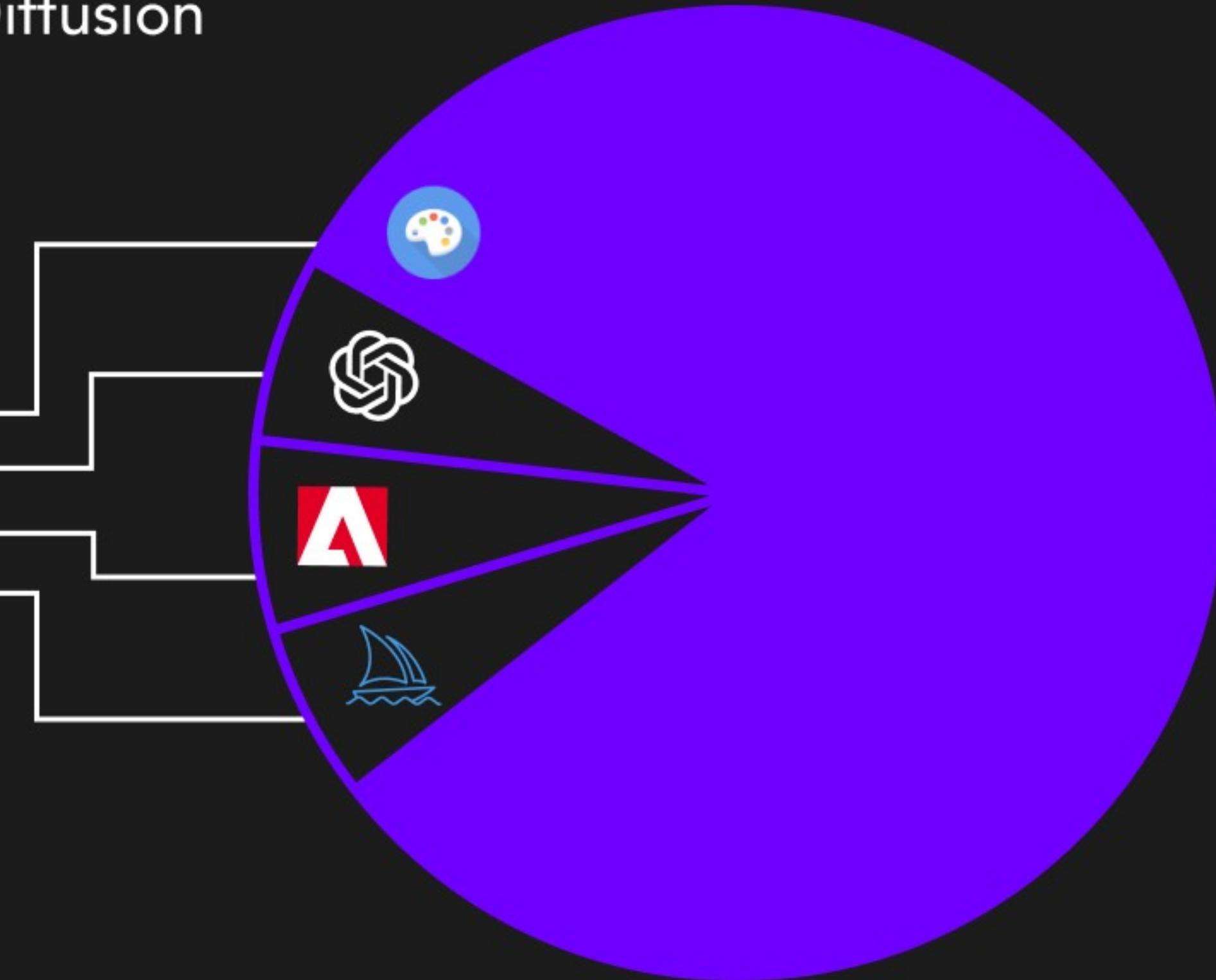
**12.590 billion**

Adobe Firefly

**1 billion**

Midjourney

**964 million**



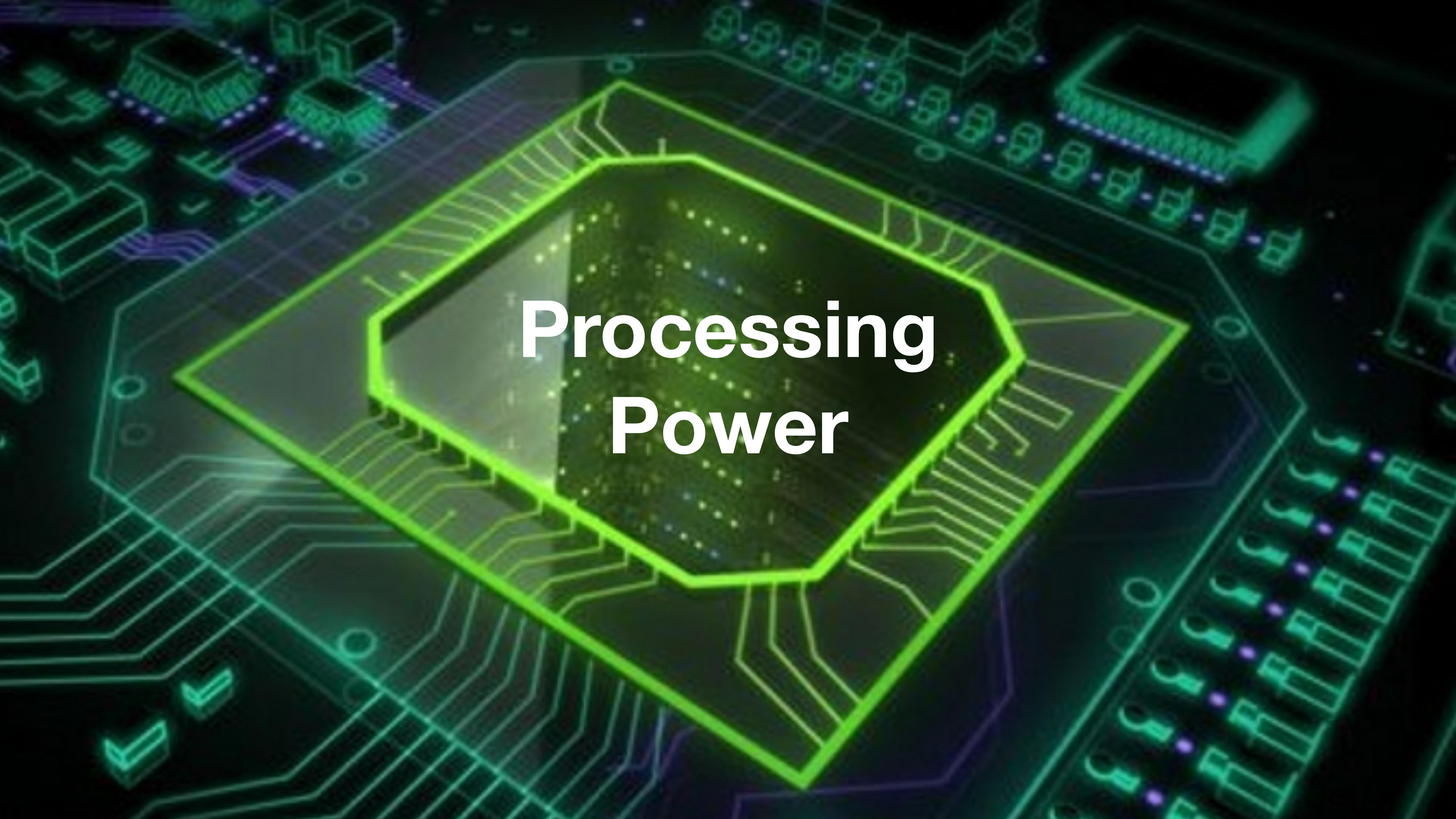
**15.470 billion**

Sources: Adobe;  
our estimates, based on Photutorial, OpenAI, Civitai

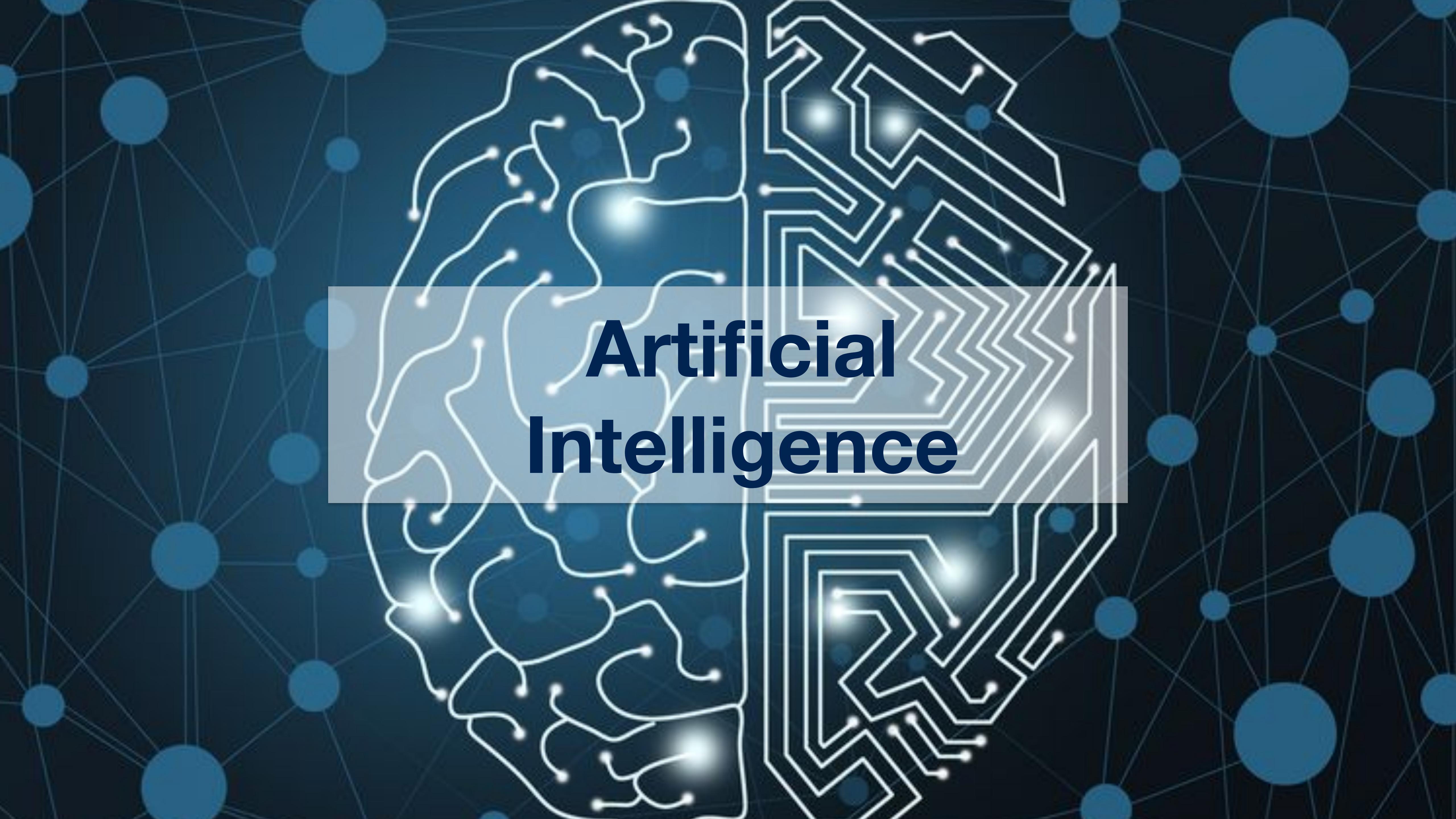
\*As of August 2023

A dense, overlapping collage of numerous human faces from various ethnicities and ages, filling the entire frame.

**Data!**  
**(as never before)**



Processing  
Power



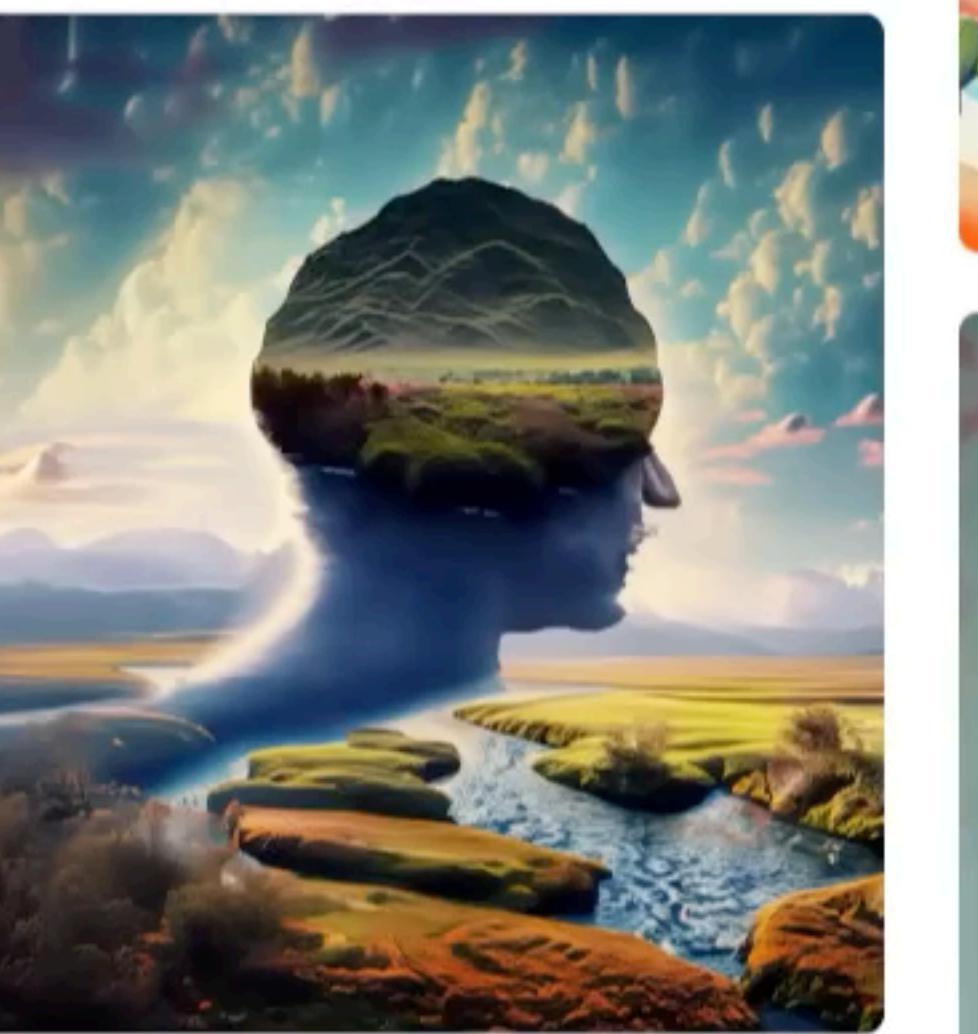
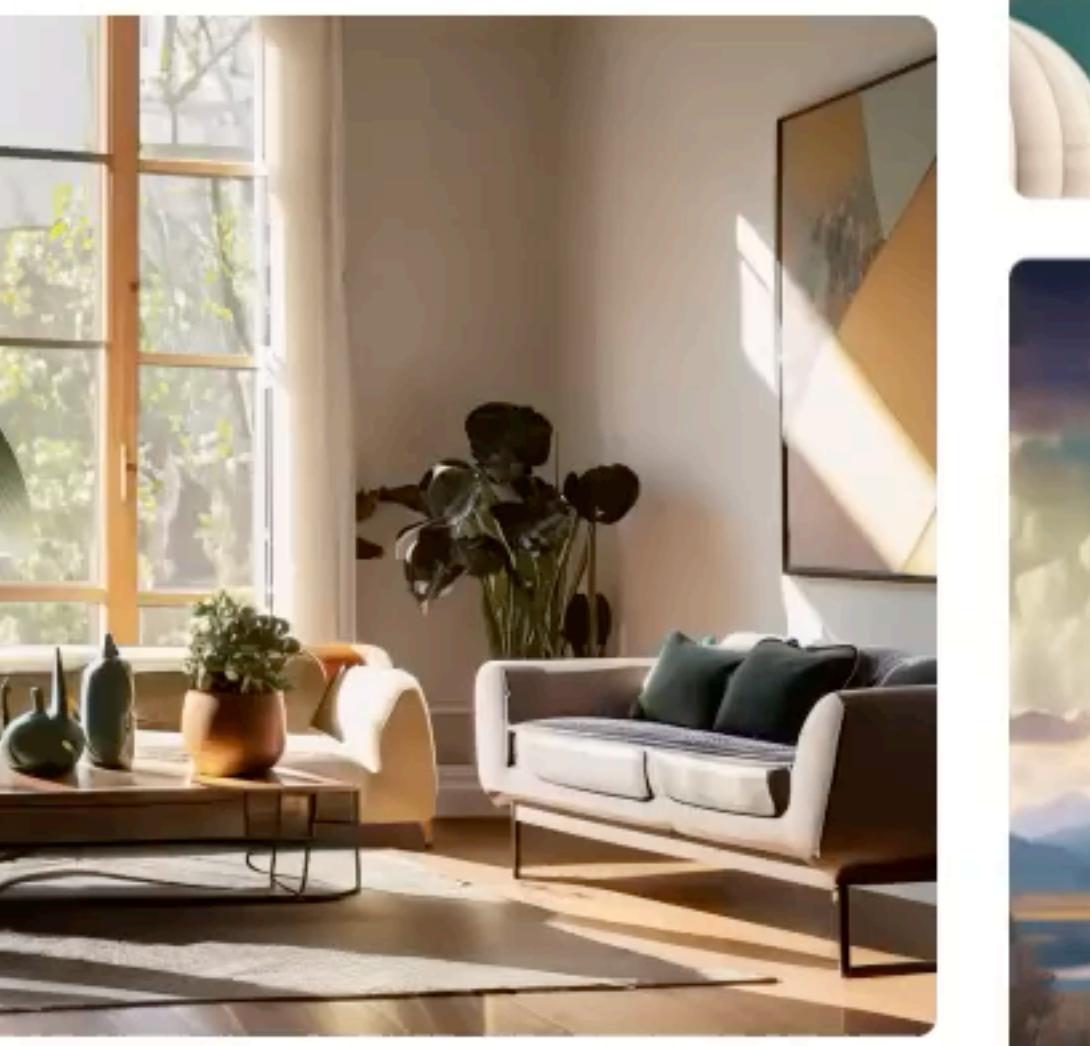
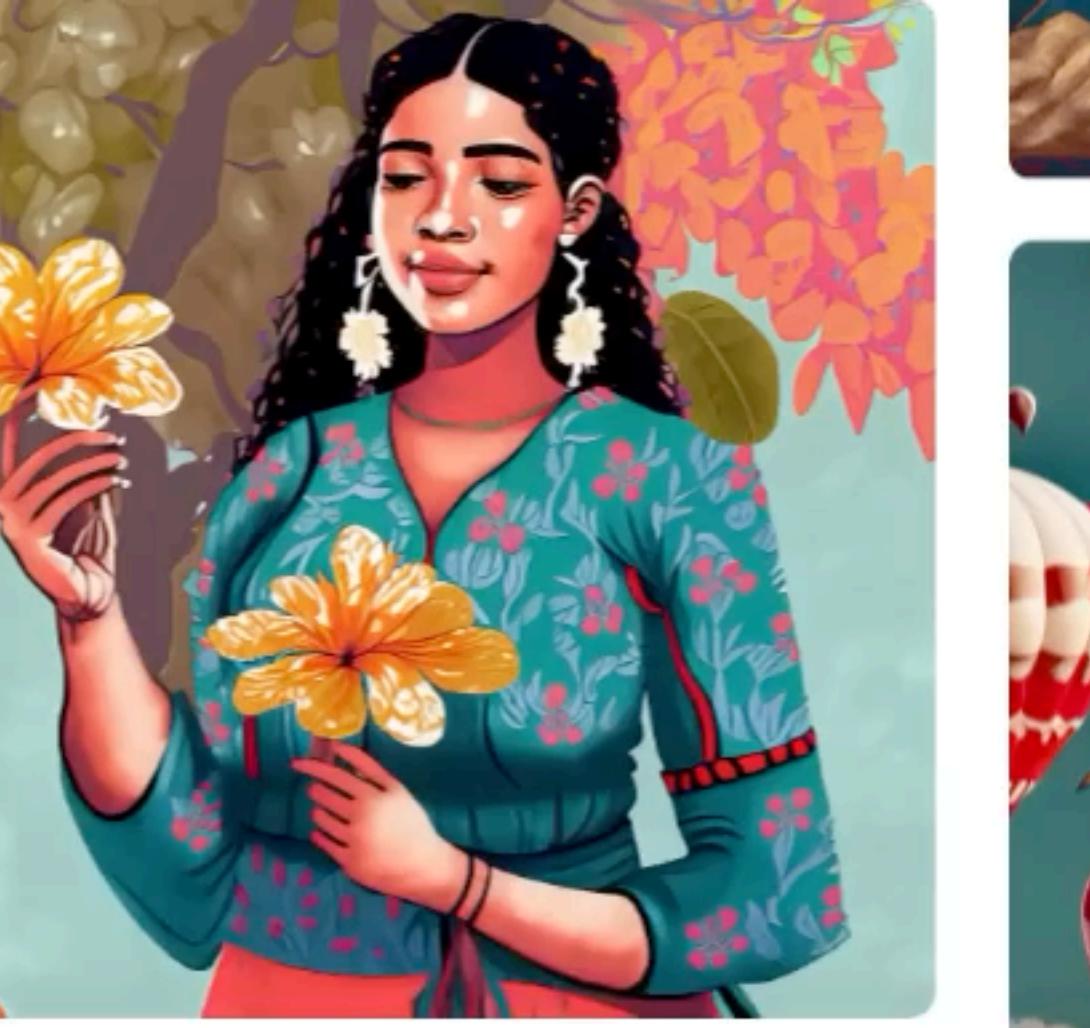
# **Artificial Intelligence**

Théâtre d'Opéra Spatial by Jason M. Allen





**Jason Allen** at his Atelier, Colorado, U.S.





runway

# All digital content has a history

In this new world of synthetic media and generative AI, the need for transparency has arrived. Using C2PA, Truepic provides publishers, creators, and consumers the ability to trace the origin of different types of media.

**2.8B**

people regularly use image editing apps

**34.0M**

images are generated with AI every day

**51.1%**

of online misinformation comes from manipulated images

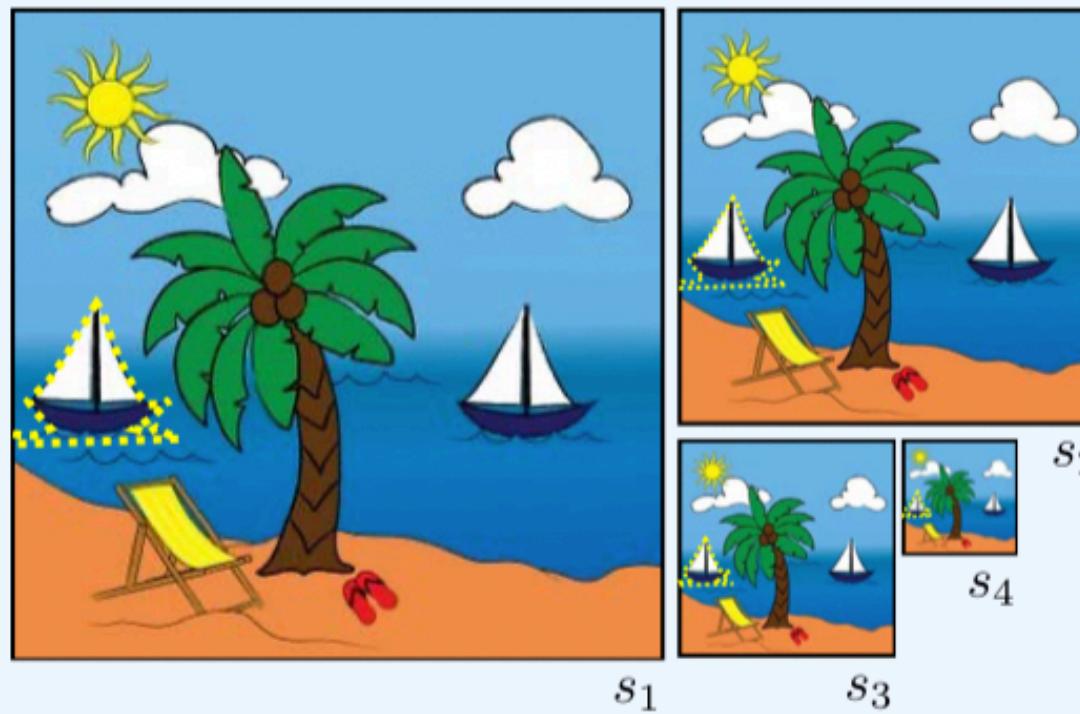
What can we do?

# Empower detection methods

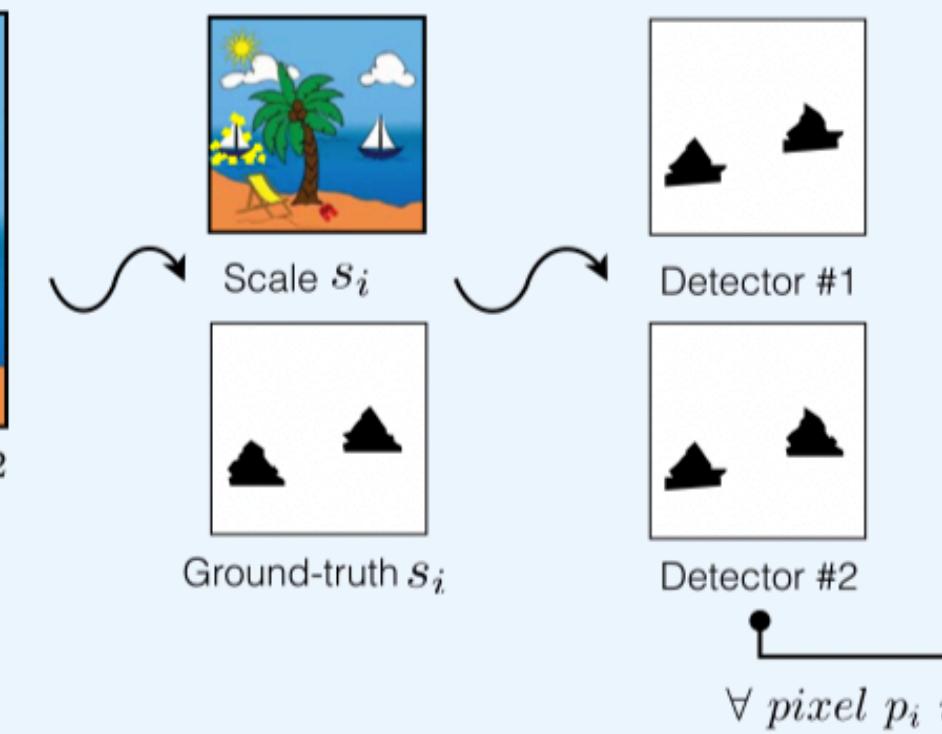
## Training Stage

©A. Rocha

(1) Multi-scale (Pyramidal) Decomposition



(2) Detection Step

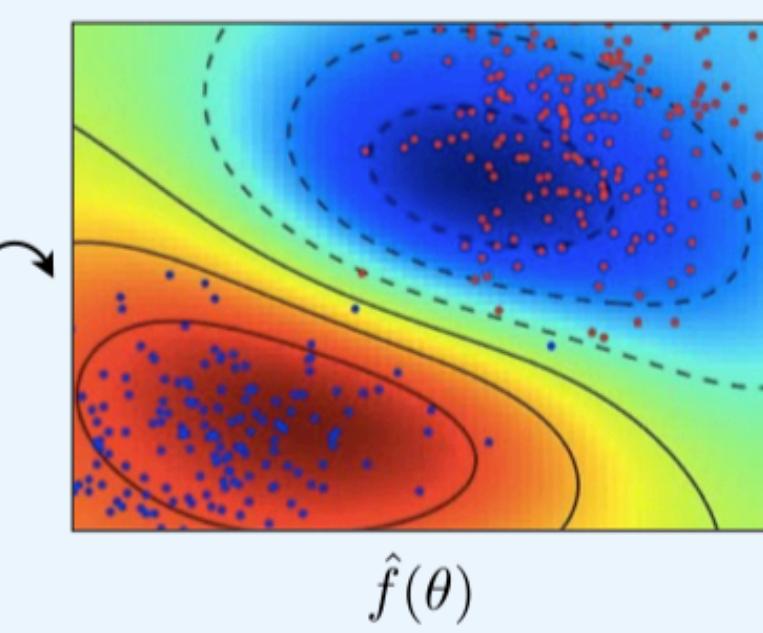


(3) Behavior Knowledge Space  
(Still Incomplete)

Event	Probability
0 0	NULL
0 1	0.65
1 0	NULL
1 1	0.99

$\forall$  pixel  $p_i$  in detection map  $M_j$

(3) Generative Model Completion



(4) Behavior Knowledge Space  
(Complete)

Event	Probability
0 0	0.03
0 1	0.62
1 0	0.12
1 1	0.94

## Testing Stage

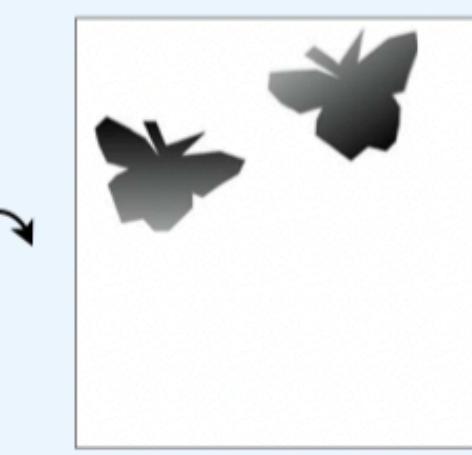


$\forall$  Scale  $s_i$

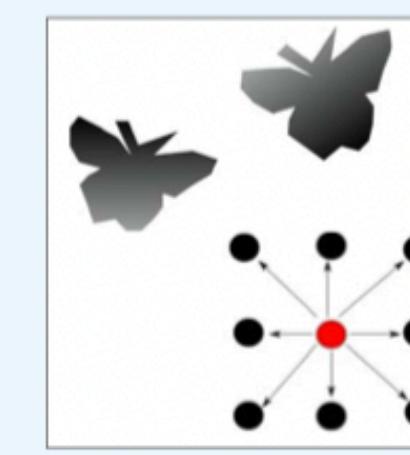
$\forall$  pixel  $p_i$   
in detection map  $M_j$



(a) Query **BKS Model** for  
Pixel Forgery Probabilities



(b) Probability Map



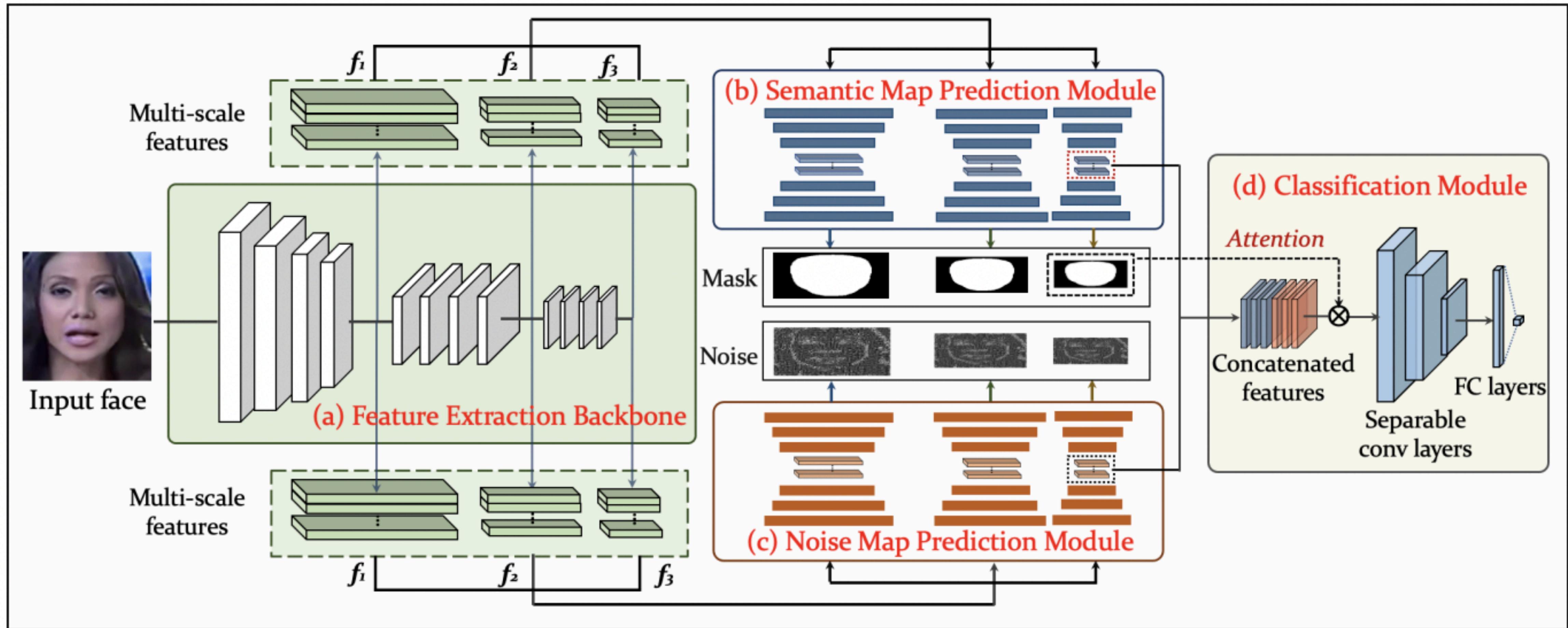
(c) Neighborhood  
Analysis



Final Detection Map

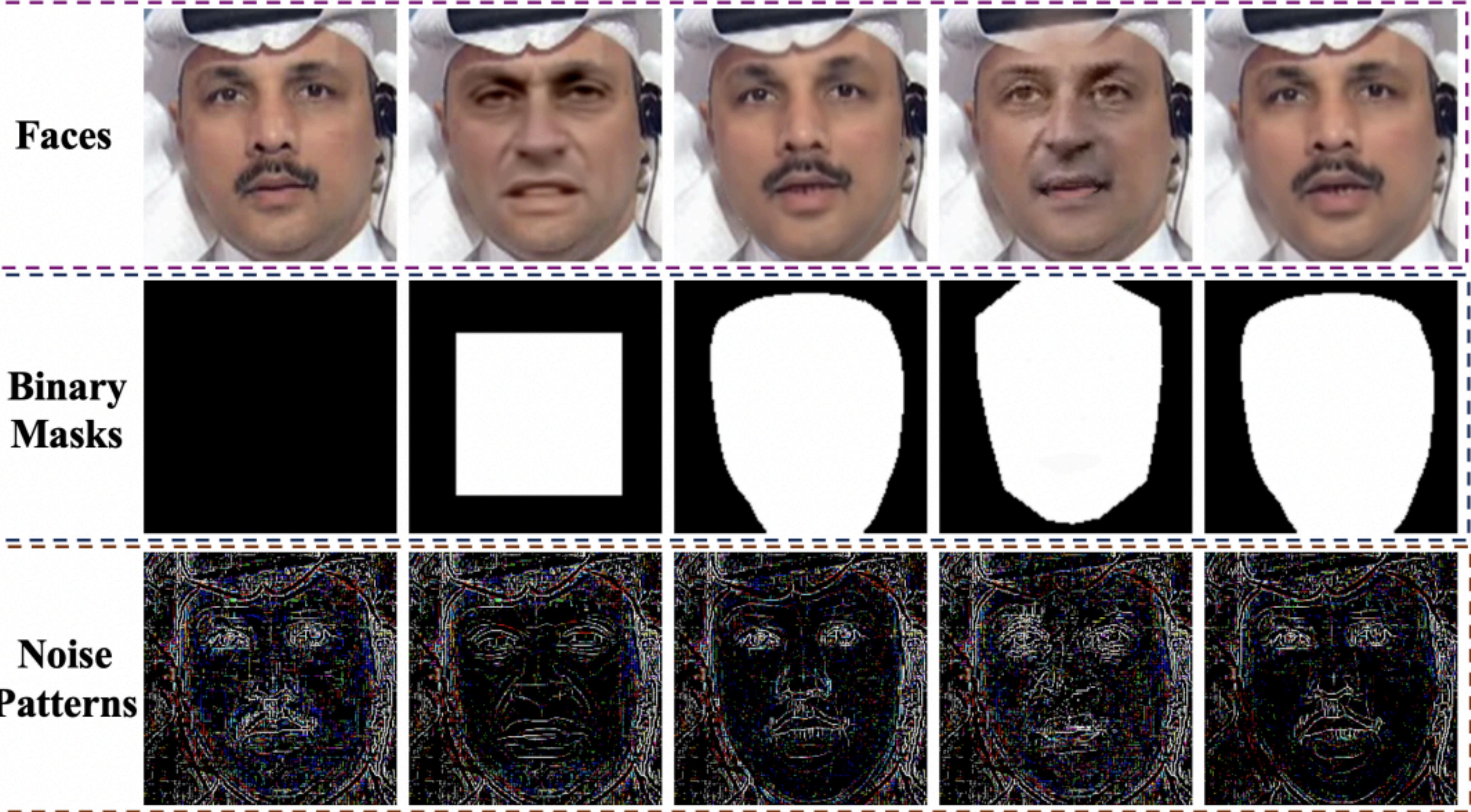
Ferreira, Anselmo, et al. "Behavior knowledge space-based fusion for copy-move forgery detection." IEEE Transactions on Image Processing 25.10 (2016): 4729-4742.

# Explore unseen telltales



Kong, Chenqi, et al. "Detect and locate: Exposing face manipulation by semantic-and noise-level telltales." IEEE Transactions on Information Forensics and Security 17 (2022): 1741-1756.

# Explore unseen telltales



# SYNTHETIC REALITIES: WHERE ARE WE?

## Overview Paper

# The Age of Synthetic Realities: Challenges and Opportunities

João Phillippe Cardenuto<sup>1\*</sup>, Jing Yang<sup>1</sup>, Rafael Padilha<sup>1</sup>, Renjie Wan<sup>2</sup>, Daniel Moreira<sup>3</sup>, Haoliang Li<sup>4</sup>, Shiqi Wang<sup>5</sup>, Fernanda Andaló<sup>1</sup>, Sébastien Marcel<sup>6,7</sup> and Anderson Rocha<sup>1</sup>

<sup>1</sup>Artificial Intelligence Lab., [Recod.ai](#), Institute of Computing, Universidade Estadual de Campinas, Campinas, SP, Brazil

<sup>2</sup>Department of Computer Science, Hong Kong Baptist University, Hong Kong

<sup>3</sup>Department of Computer Science, Loyola University Chicago, USA

<sup>4</sup>Department of Electrical Engineering, City University of Hong Kong, Hong Kong

<sup>5</sup>Department of Computer Science, City University of Hong Kong, Hong Kong

<sup>6</sup>Idiap Research Institute, Martigny, Switzerland

<sup>7</sup>University of Lausanne, Lausanne, Switzerland



Counteracting the contemporaneous proliferation  
of digital forgeries and fake news

ALEXANDRE FERREIRA<sup>1</sup>, TIAGO CARVALHO<sup>2</sup>, FERNANDA ANDALÓ<sup>1</sup> and ANDERSON ROCHA<sup>1</sup>

<sup>1</sup>Institute of Computing, University of Campinas (Unicamp),  
Av. Albert Einstein, 1251, 13083-852 Campinas, SP, Brazil

<sup>2</sup>Instituto Federal de São Paulo (IFSP), Av. Comendador Aladino Selmi, s/n,  
13069-901 Campinas, SP, Brazil

## Leveraging Ensembles and Self-Supervised Learning for Fully-Unsupervised Person Re-Identification and Text Authorship Attribution

Gabriel Bertocco, Antonio Theophilo, Fernanda Andaló, *Member, IEEE*,  
and Anderson Rocha, *Senior Member, IEEE*

## EXPLAINABLE ARTIFICIAL INTELLIGENCE FOR AUTHORSHIP ATTRIBUTION ON SOCIAL MEDIA

Antonio Theophilo<sup>\*†</sup>, Rafael Padilha<sup>\*</sup>, Fernanda A. Andaló<sup>\*</sup>, Anderson Rocha<sup>\*</sup>

\* Artificial Intelligence Lab. ([Recod.ai](#))

Institute of Computing, University of Campinas, Brazil

† Center for Information Technology Renato Archer, Campinas, Brazil

## Content-Based Detection of Temporal Metadata Manipulation

Rafael Padilha<sup>1</sup>✉, Tawfiq Salem<sup>2</sup>, Scott Workman<sup>3</sup>,  
Fernanda A. Andaló<sup>1</sup>, Anderson Rocha<sup>1</sup>, Nathan Jacobs<sup>4</sup>

<sup>1</sup> University of Campinas, Brazil

<sup>3</sup> DZYNE Technologies, USA

<sup>2</sup> Purdue University, USA

<sup>4</sup> University of Kentucky, USA

## Forensic Event Analysis: From Seemingly Unrelated Data to Understanding

Rafael Padilha, Caroline Mazini Rodrigues, Fernanda Andaló,  
Gabriel Bertocco, Zanoni Dias, and Anderson Rocha

# How to stop AI deepfakes from sinking society – and science

Deceptive videos and images created using generative AI could sway elections, crash stock markets and ruin reputations. Researchers are developing methods to limit their harm.

By [Nicola Jones](#)

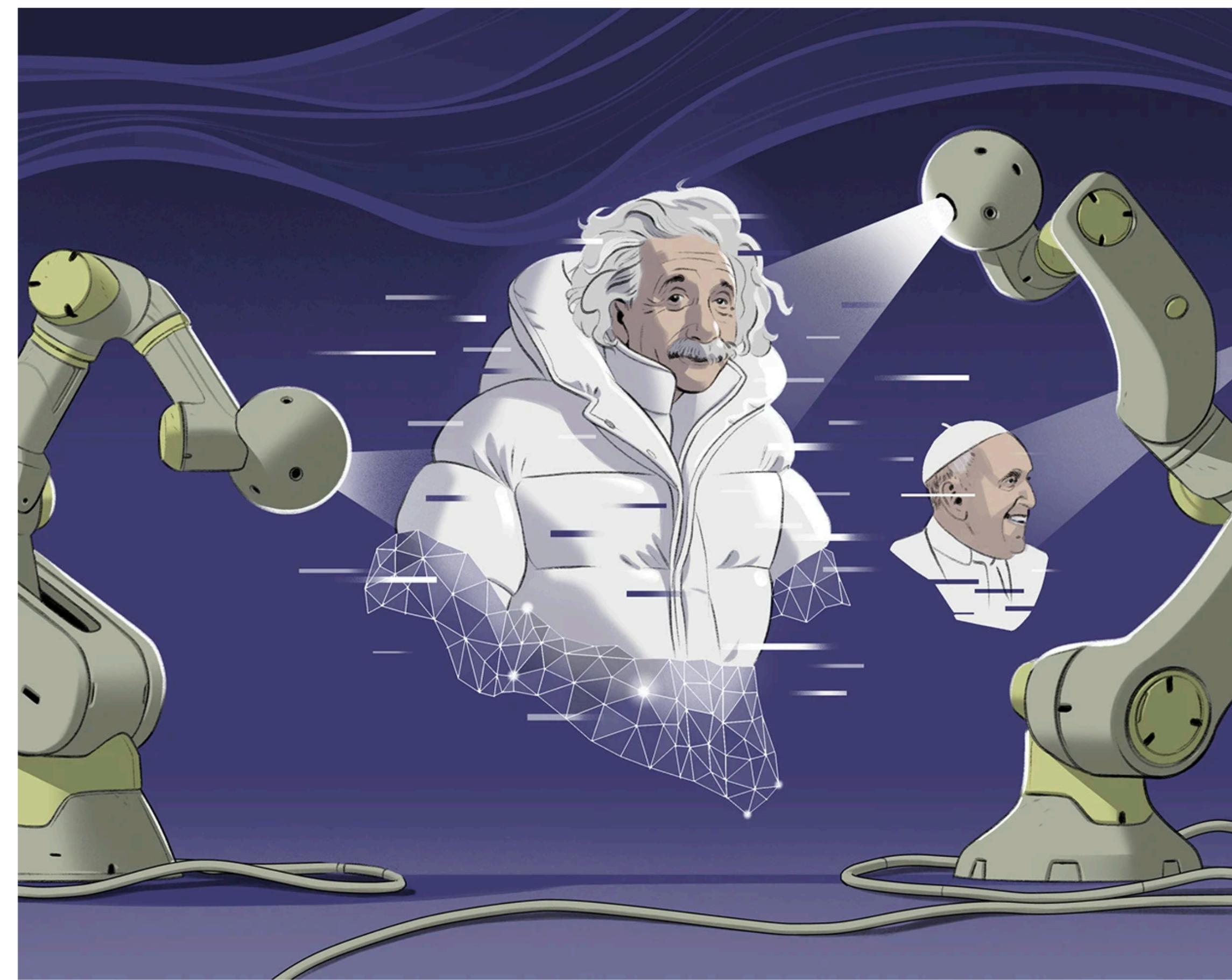


Illustration by Señor Salme

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## SILA: a system for scientific image analysis

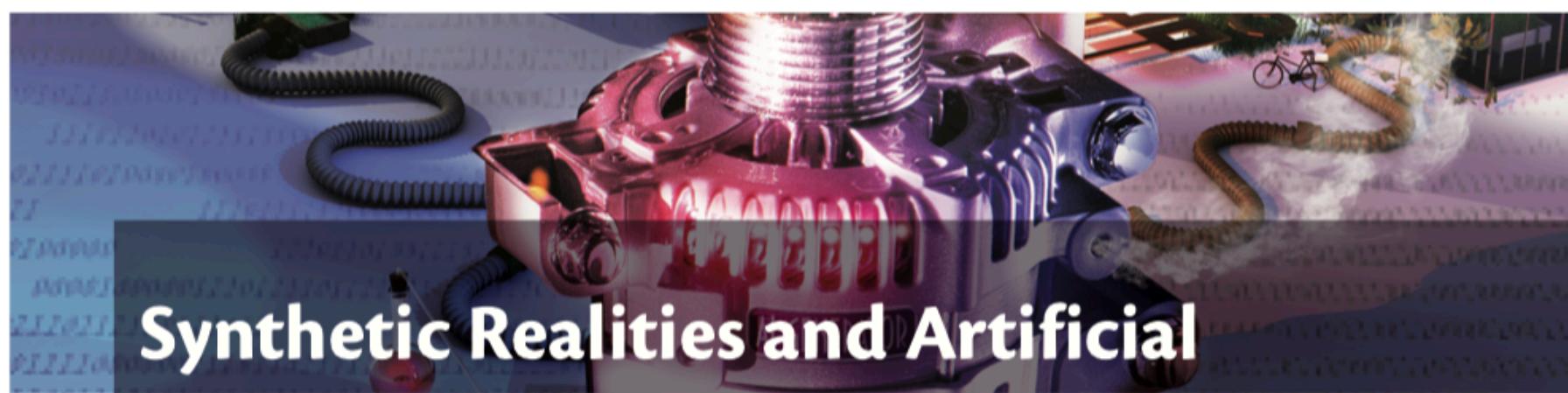
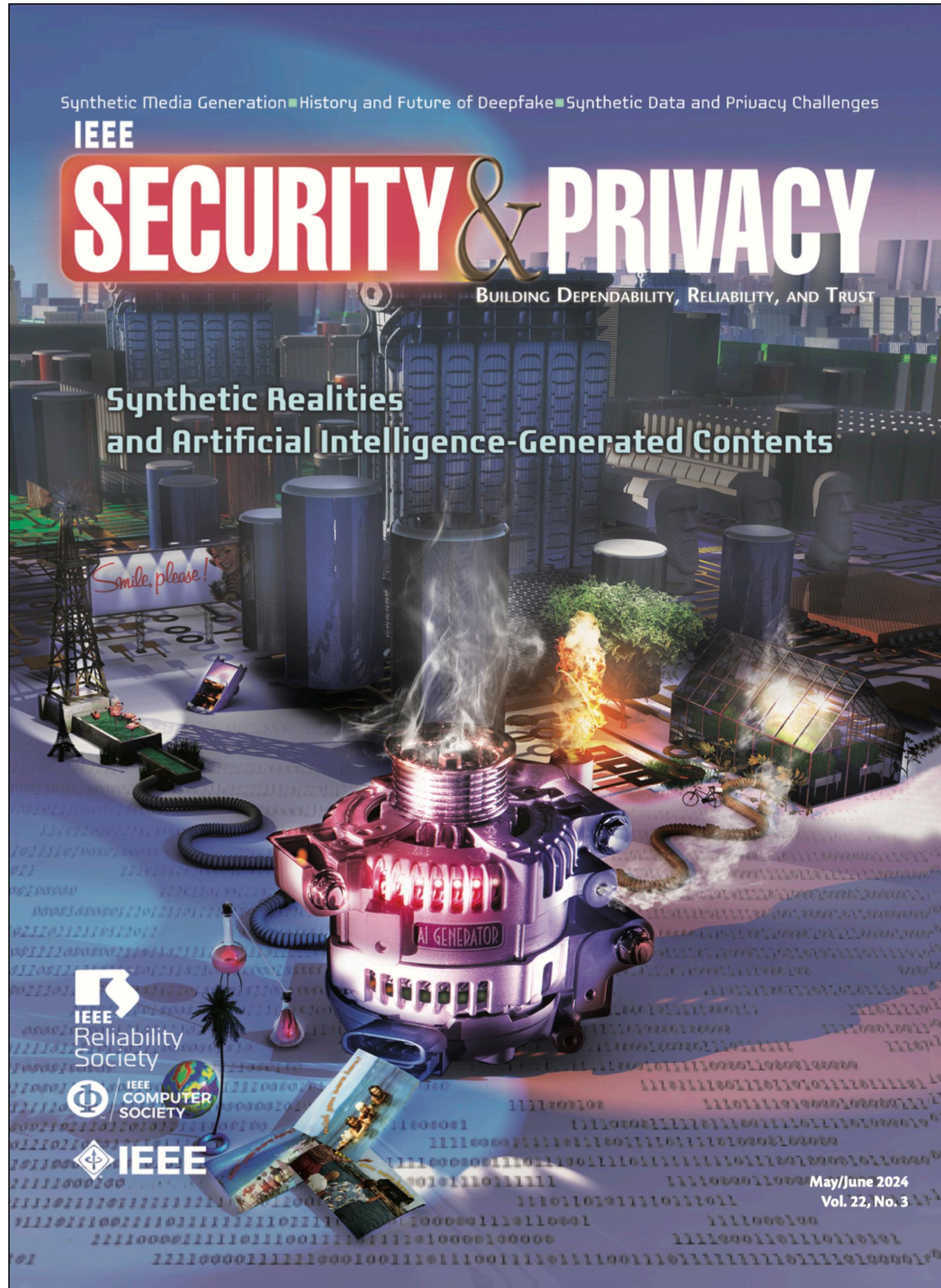
[Daniel Moreira](#), [João Phillippe Cardenuto](#), [Ruiting Shao](#), [Sriram Baireddy](#), [Davide Cozzolino](#), [Diego Gragnaniello](#), [Wael Abd-Almageed](#), [Paolo Bestagini](#), [Stefano Tubaro](#), [Anderson Rocha](#), [Walter Scheirer](#), [Luisa Verdoliva](#) & [Edward Delp](#)✉

[Scientific Reports](#) 12, Article number: 18306 (2022) | [Cite this article](#)

6552 Accesses | 27 Altmetric | [Metrics](#)

### Abstract

A great deal of the images found in scientific publications are retouched, reused, or composed to enhance the quality of the presentation. In most instances, these edits are benign and help the reader better understand the material in a paper. However, some edits are instances of scientific misconduct and undermine the integrity of the presented research. Determining the legitimacy of edits made to scientific images is an open problem that no current technology can perform satisfactorily in a fully automated fashion. It thus remains up to human experts to inspect images as part of the peer-review process. Nonetheless, image analysis technologies promise to become helpful to experts to perform such an essential yet arduous task. Therefore, we introduce SILA, a system that makes



## Synthetic Realities and Artificial Intelligence-Generated Contents

Daniel Moreira | Loyola University Chicago  
Sébastien Marcel | Idiap Research Institute  
Anderson Rocha | University of Campinas

Welcome to the *IEEE Security & Privacy* special issue on synthetic realities and artificial intelligence-generated contents! In this edition, we delve into the topic of synthetic realities, where generative artificial intelligence (GAI) is revolutionizing the construction of narratives, blurring the boundaries between fact and fiction, for the good and the bad. Indeed, content created or enabled by GAI spans a wide spectrum of usage and intentions, from fostering positive experiences, such as entertainment, training, and education, to more questionable utilization, such as deception, propaganda, and manipulation.

With the advent and maturity of GAI techniques, much has changed in forensics, security, and privacy. The way researchers and experts have been doing forensics and security over the past decades is continuously challenged with each new version of powerful AI content generators. The synthetic content ranges from audio, image, and video to text and their combinations, coming from prominent models, such as ChatGPT, LaMDA, ImageGen, StableDiffusion, Sora, and Gemini, among others.

This special issue seeks to understand the required changes in the way forensics, security, and privacy experts operate, including how to deal with autogenerated fake and synthetic data (e.g., text, images, videos,

Digital Object Identifier 10.1109/MSEC.2024.3388244  
Date of current version: 10 May 2024

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May/June 2024

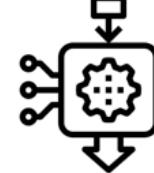
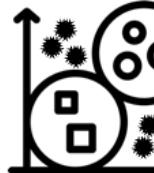
7

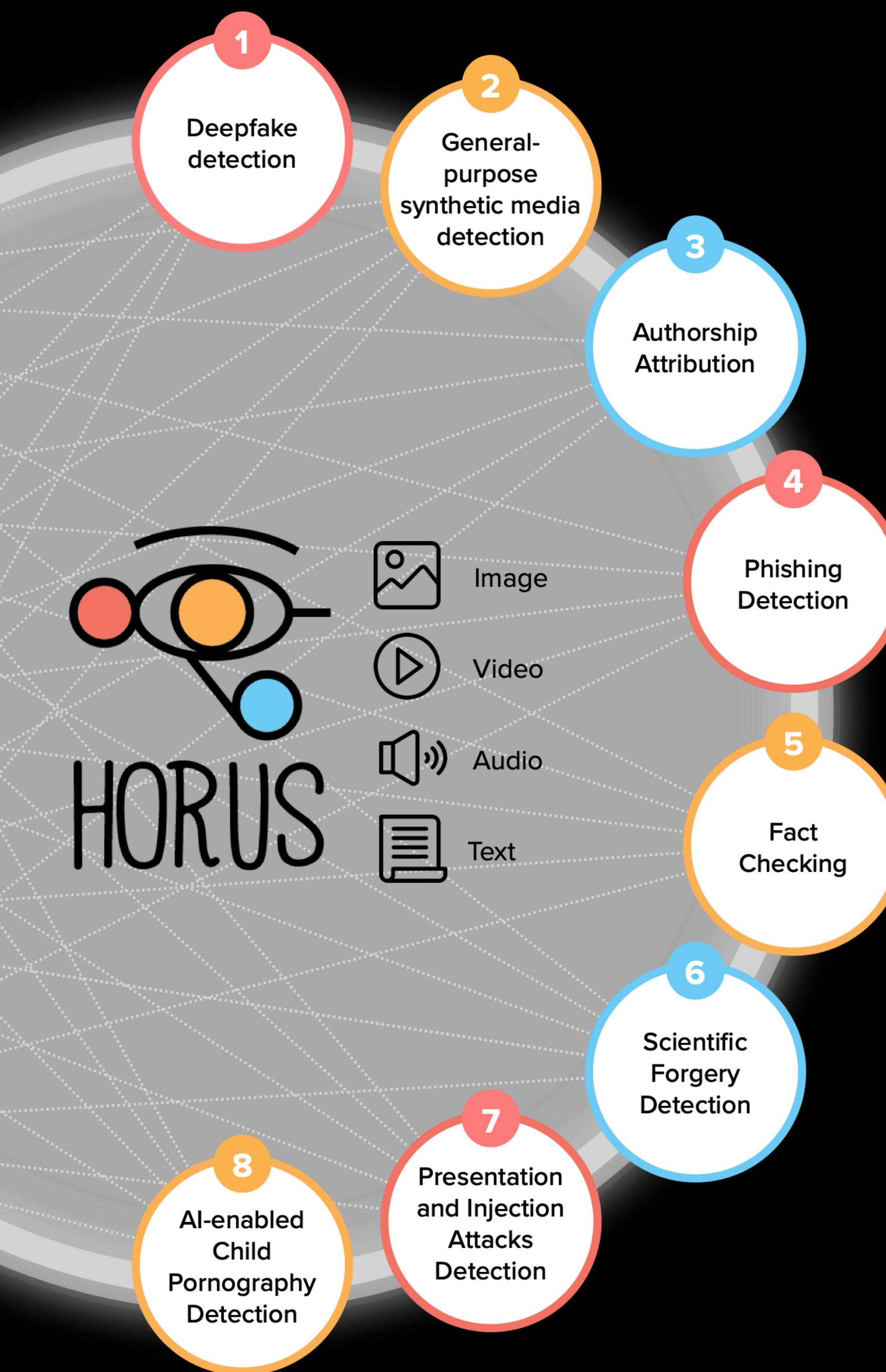


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and 3D content), how much autogeneration methods are “shaping” new realities that do not exist, and what it means for our society. The call presented the following important questions: What are the possible new applications for forensics, security, and privacy? What are the threats and challenges? Forensic aspects should include any topics related to post hoc investigation practices after the occurrence of events regarding created content (eg, generated fake news or deepfakes and how to detect them). Security aspects should include topics related to how such contents might affect our lives in terms of document authenticity and deception. Privacy should



- A Robust Feature Learning** 
- B Open-set Recognition** 
- C Self-supervised Learning** 
- D Multi-modality of Domain & Sensors** 
- E Fusion Techniques** 

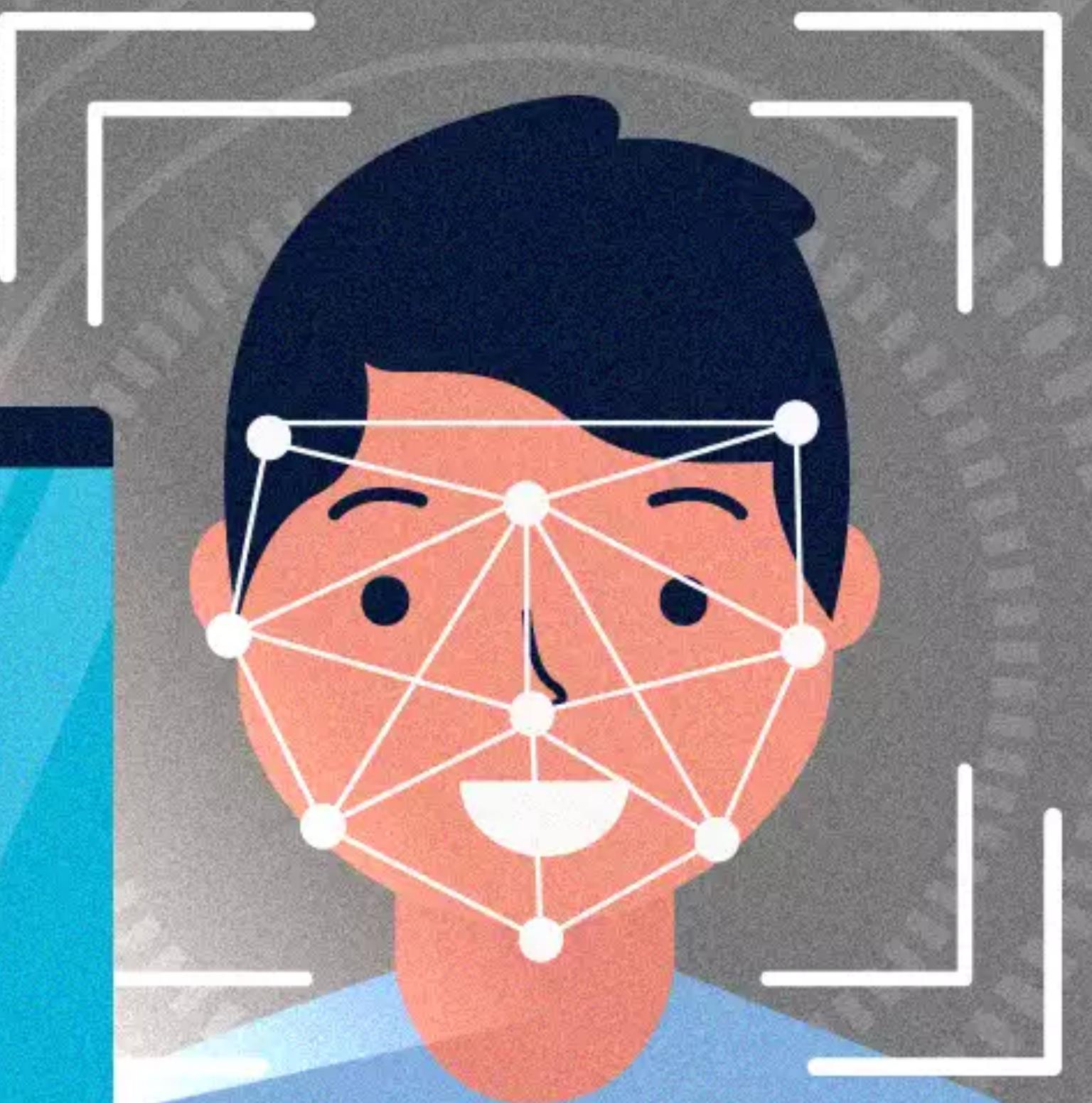


# Phishing



# Deepfake





# Communications

# Parental Control



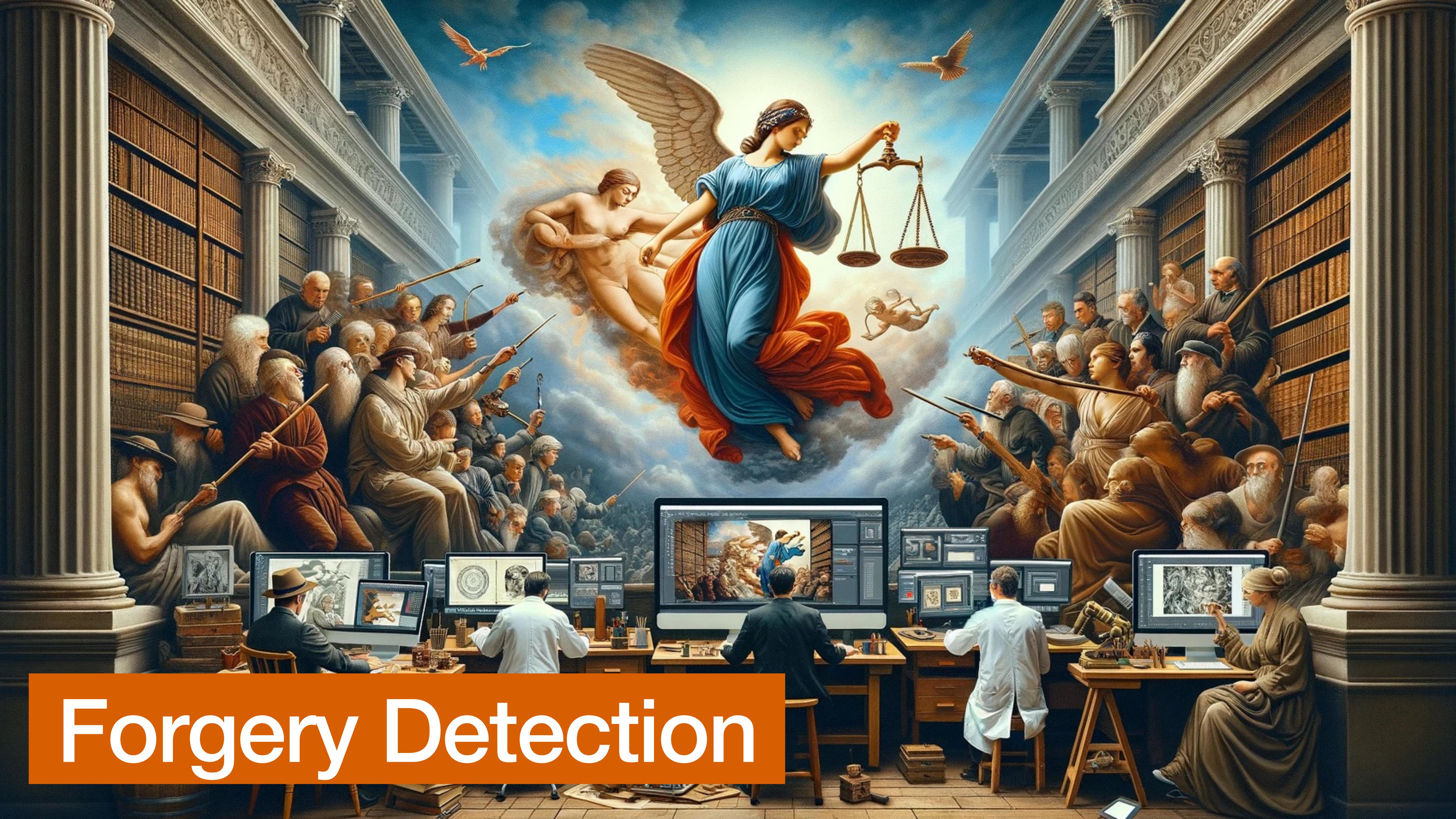
# Liveness Proof



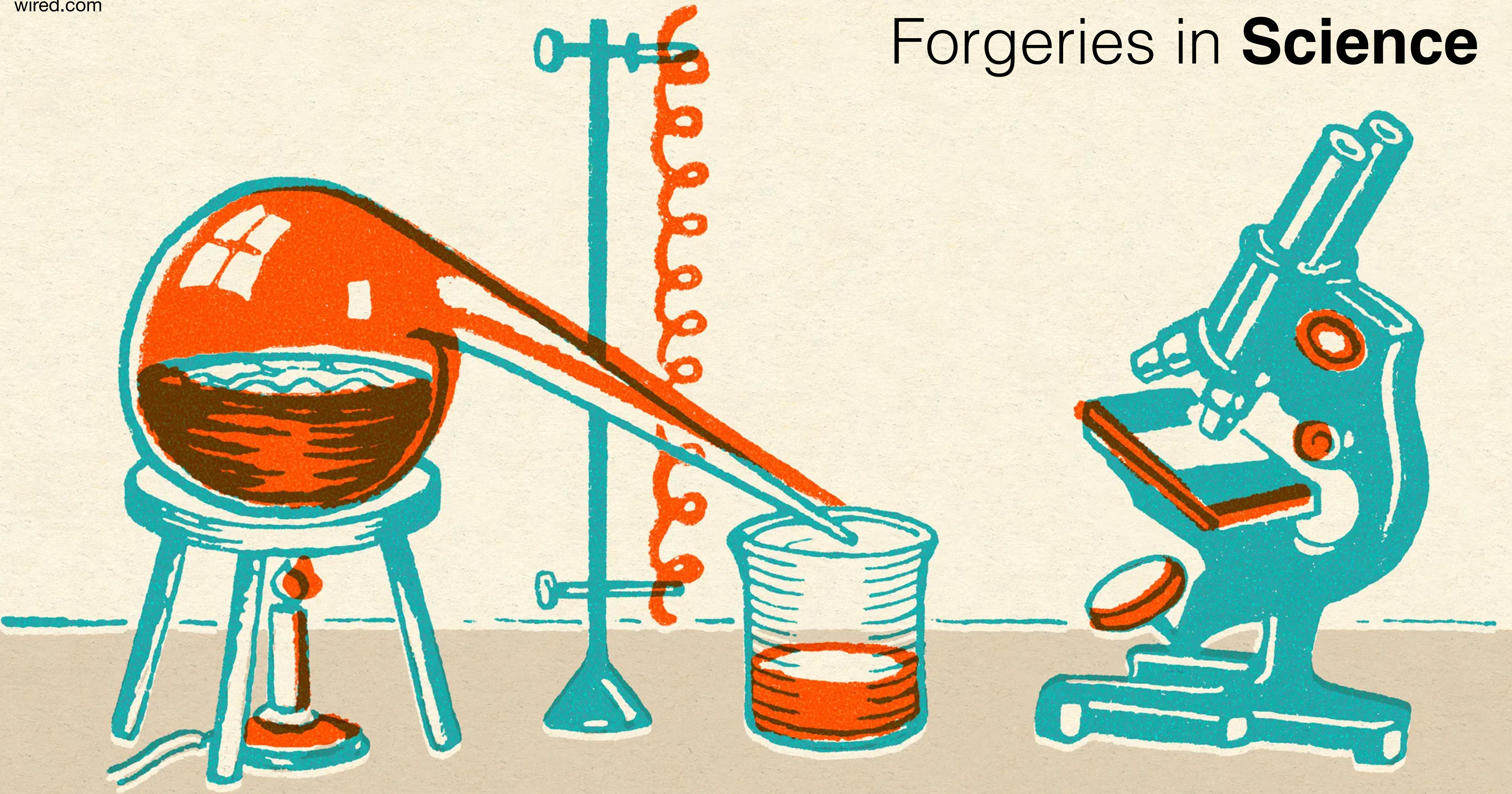
# Content Protection



# Forgery Detection



# Forgeries in Science





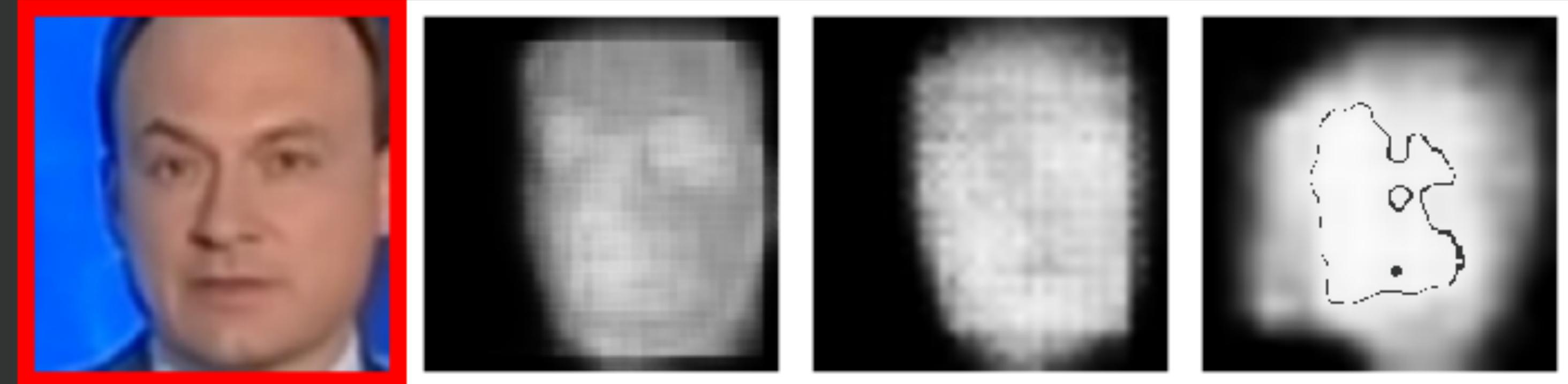
Fighting AI-enabled Child Pornography



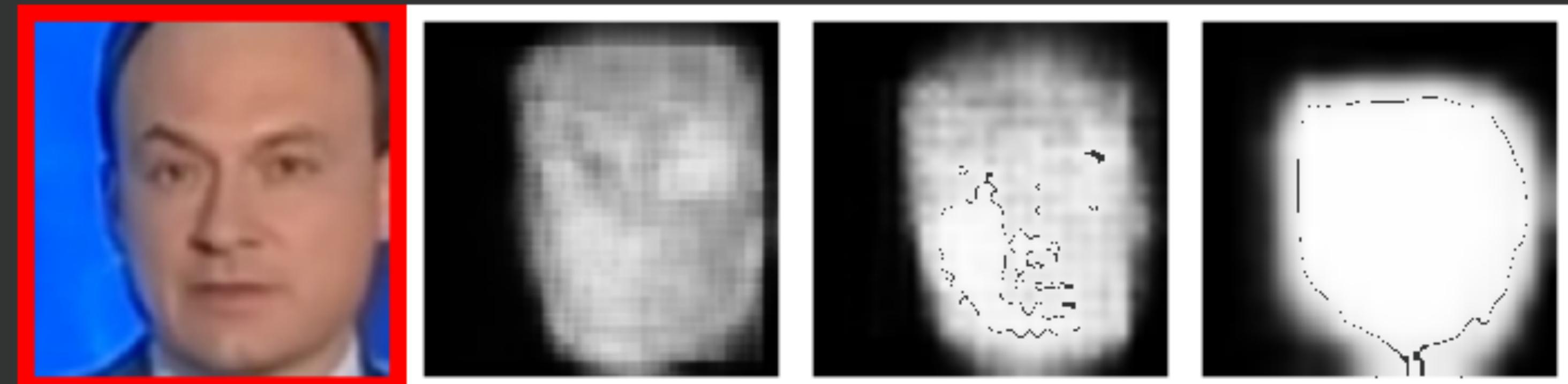
recod.ai

reasoning for complex data

# DeepFake Detection System



Probability of Fake for Expert #1: 90.07%



Probability of Fake for Expert #2: 99.81%

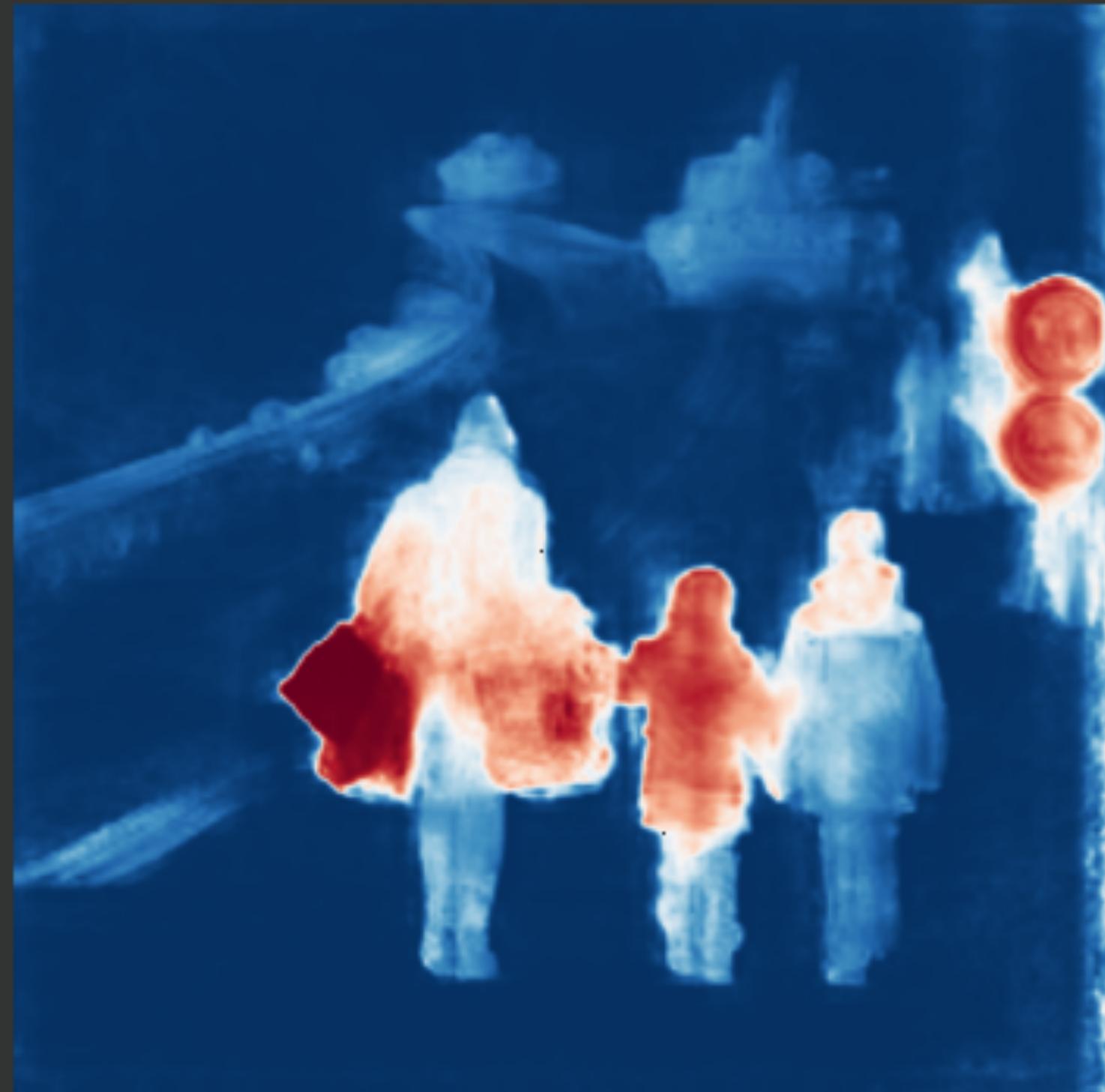
Upload Image

Detect



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reasoning for complex data

# Image Forgery Detection System



Prob. of Forgery for Expert #1: 96.06%

Prob. of Forgery for Expert #2: 52.40%

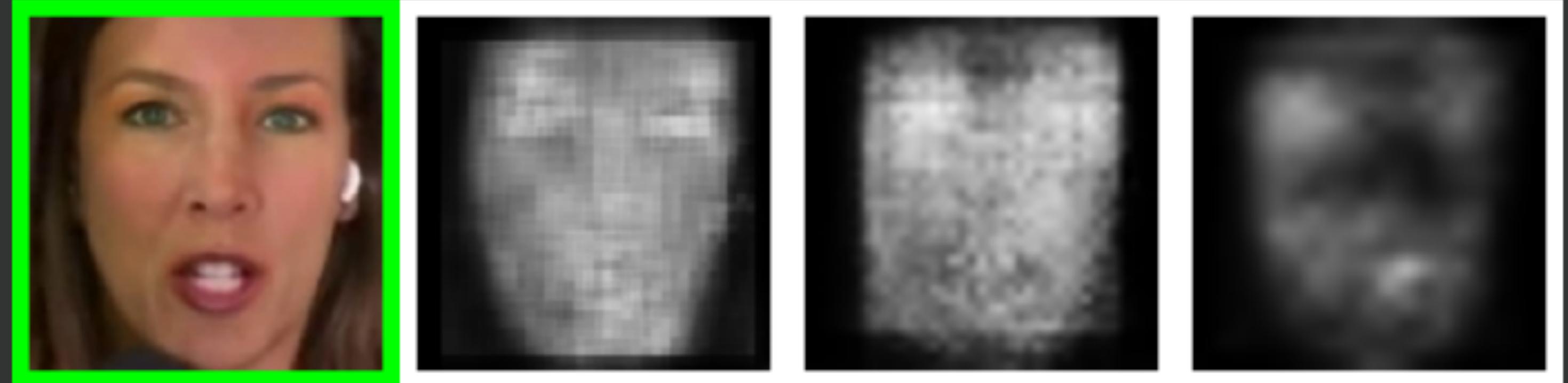
Upload Image

Detect

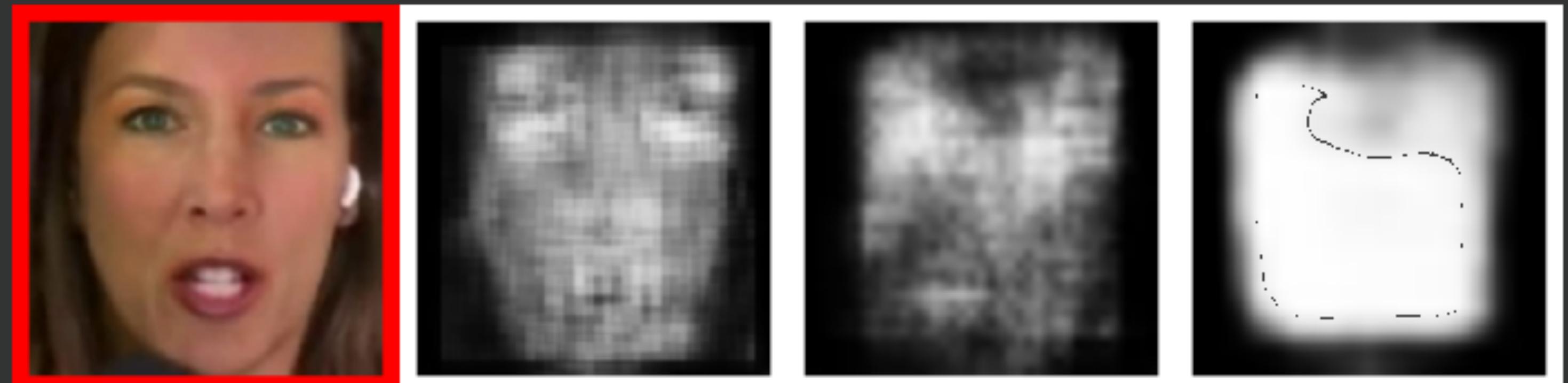


# recod.ai DeepFake Detection System

reasoning for complex data



Probability of Fake for Expert #1: 31.31%



Probability of Fake for Expert #2: 95.91%

Upload Image

Detect



recod.ai  
reasoning for complex data

# Image Forgery Detection System



Prob. of Forgery for Expert #1: 99.99%

Prob. of Forgery for Expert #2: 99.68%

Upload Image

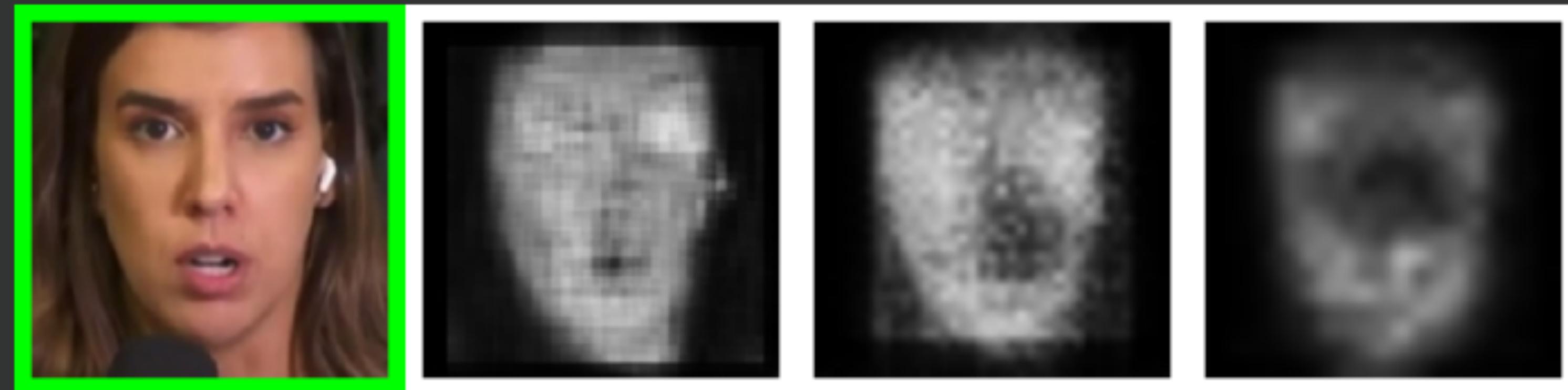
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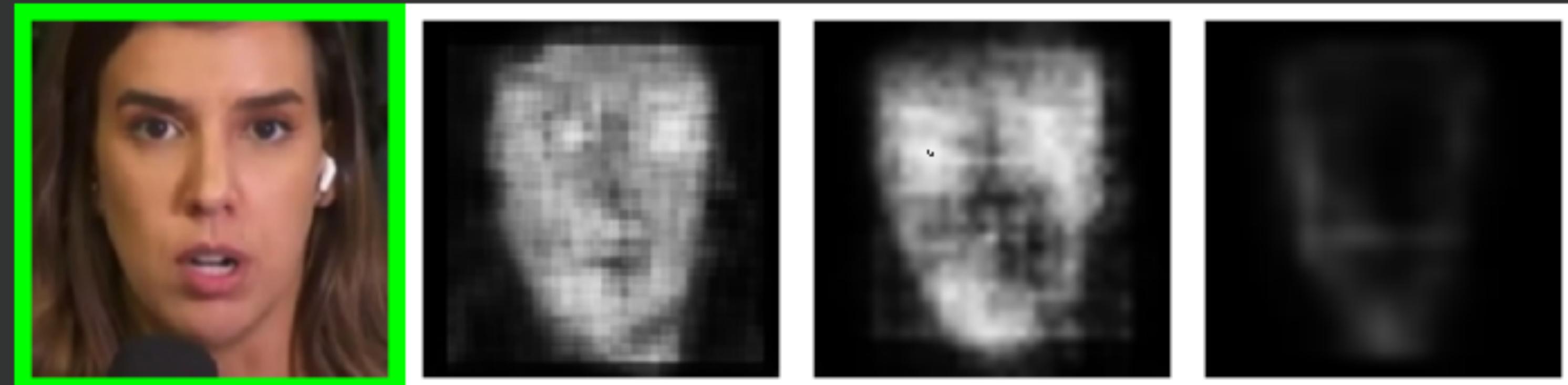
recod.ai

reasoning for complex data

# DeepFake Detection System



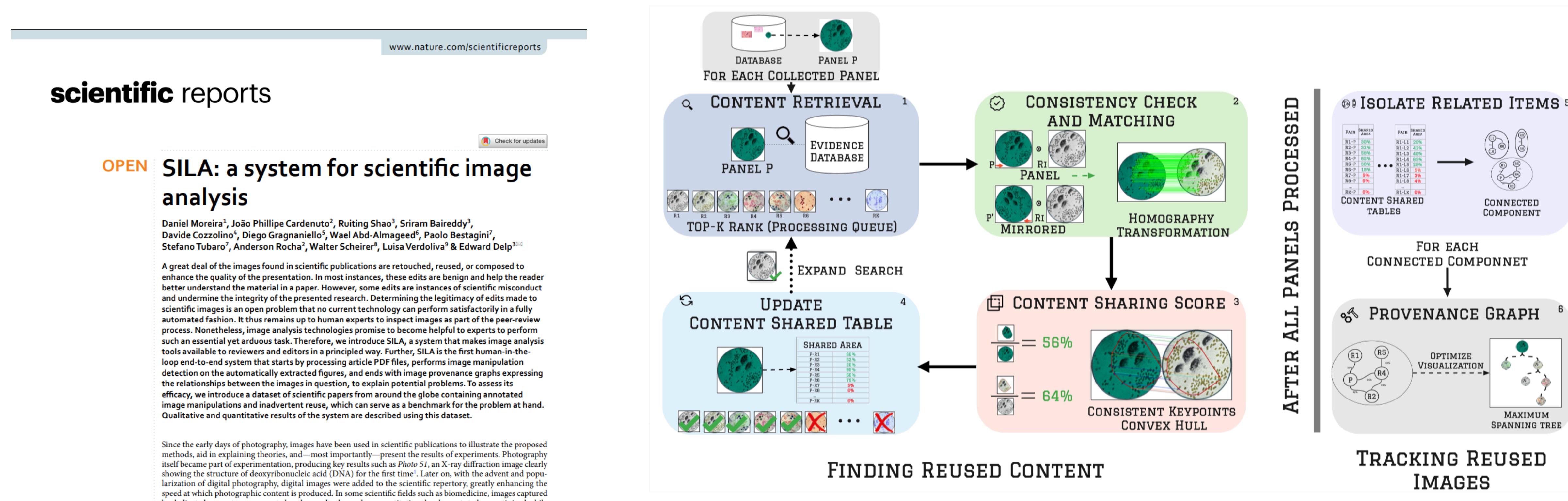
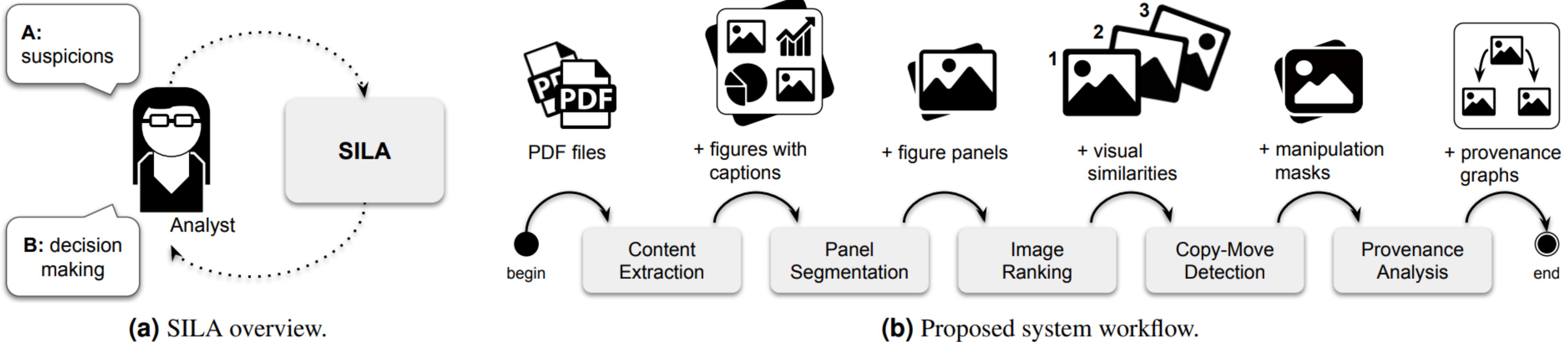
Probability of Fake for Expert #1: 18.37%



Probability of Fake for Expert #2: 7.54%

Upload Image

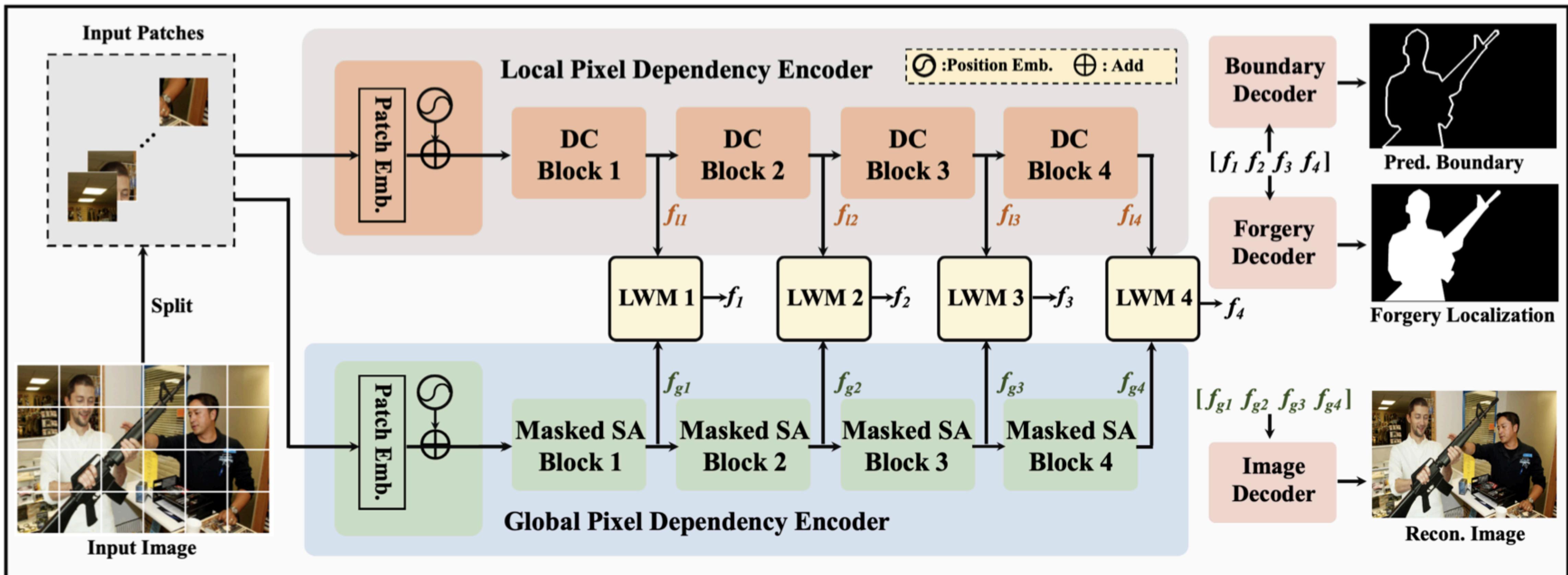
Detect



# Pixel-Inconsistency Modeling for Image Manipulation Localization

IEEE TRANSACTIONS ON  
PATTERN ANALYSIS AND  
MACHINE INTELLIGENCE

Chenqi Kong, *Member, IEEE*, Anwei Luo, Shiqi Wang, *Senior Member, IEEE*, Haoliang Li, *Member, IEEE*,  
Anderson Rocha, *Fellow, IEEE*, and Alex C. Kot, *Life Fellow, IEEE*



# FakeScope: Large Multimodal Expert Model for Transparent AI-Generated Image Forensics

Yixuan Li, Yu Tian, Yipo Huang, Wei Lu, *Member, IEEE*, Shiqi Wang<sup>†</sup>, *Senior Member, IEEE*, Weisi Lin, *Fellow, IEEE* and Anderson Rocha, *Fellow, IEEE*

IEEE TRANSACTIONS ON  
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2

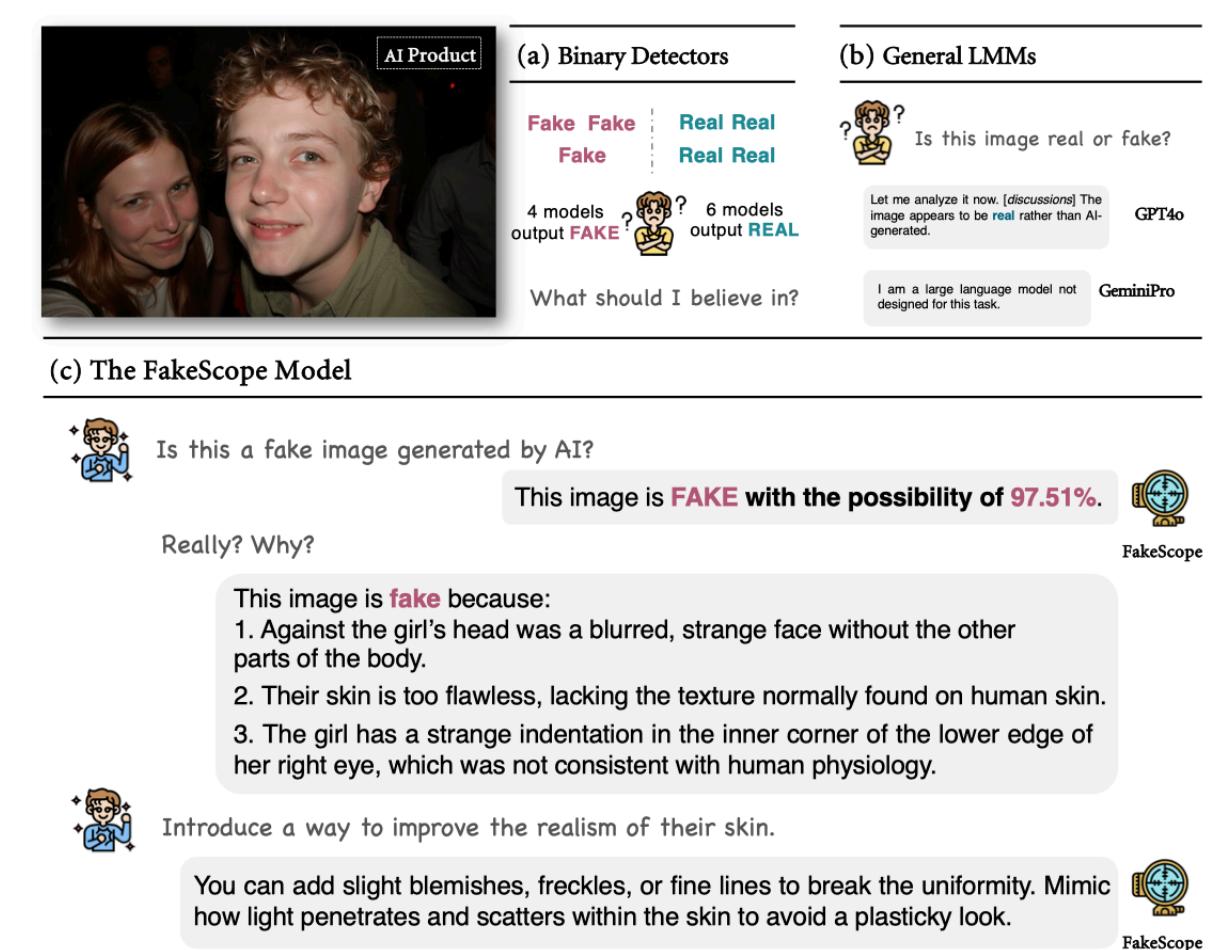
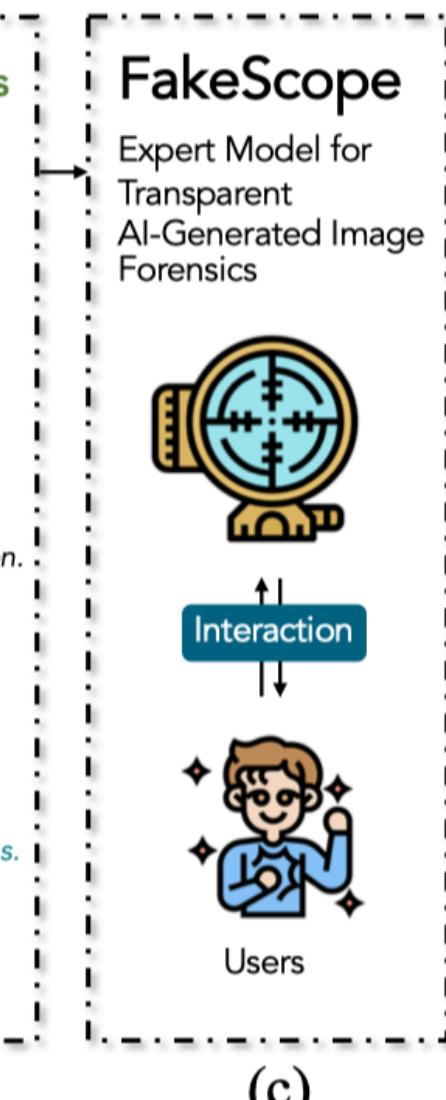
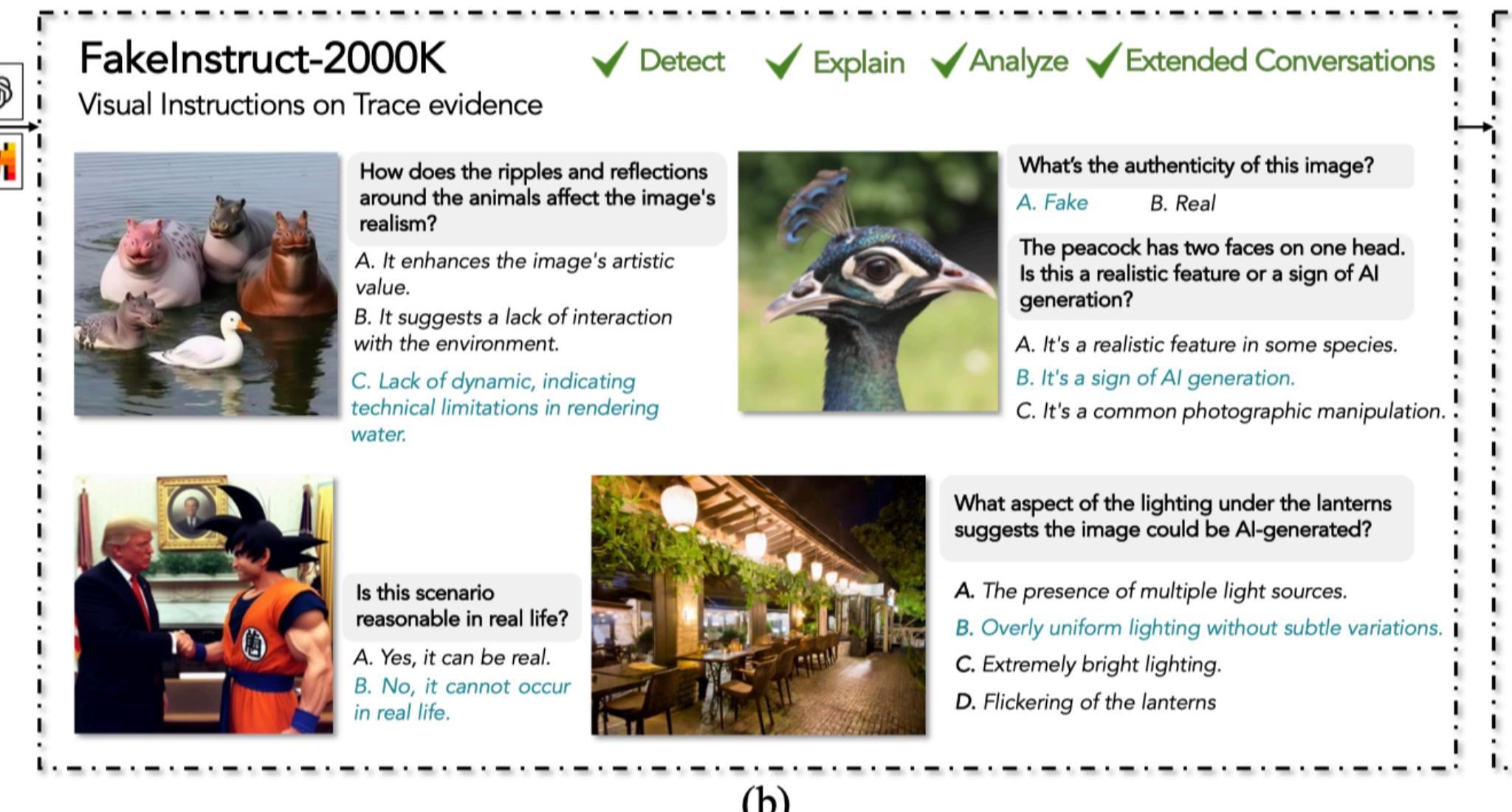
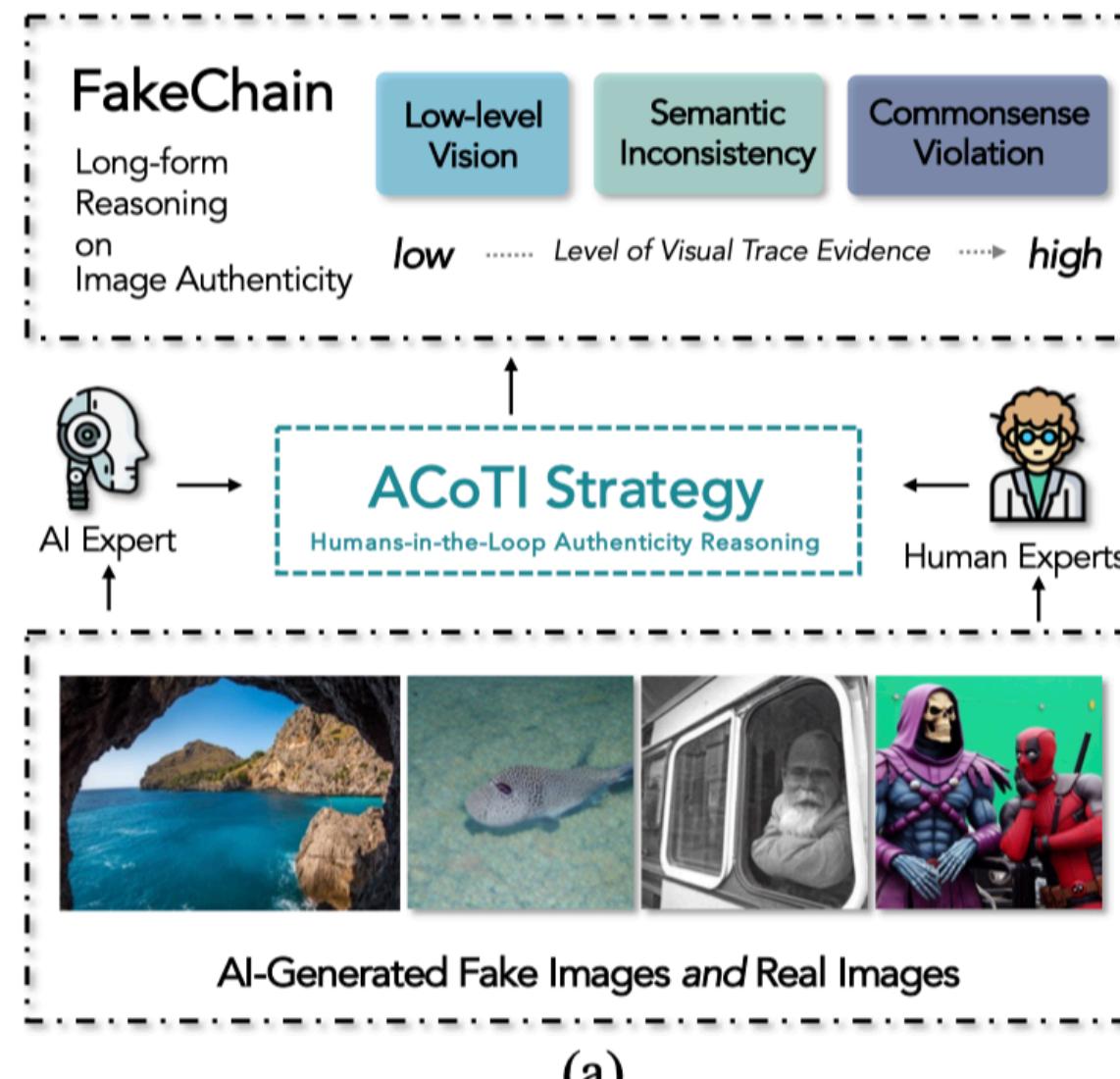
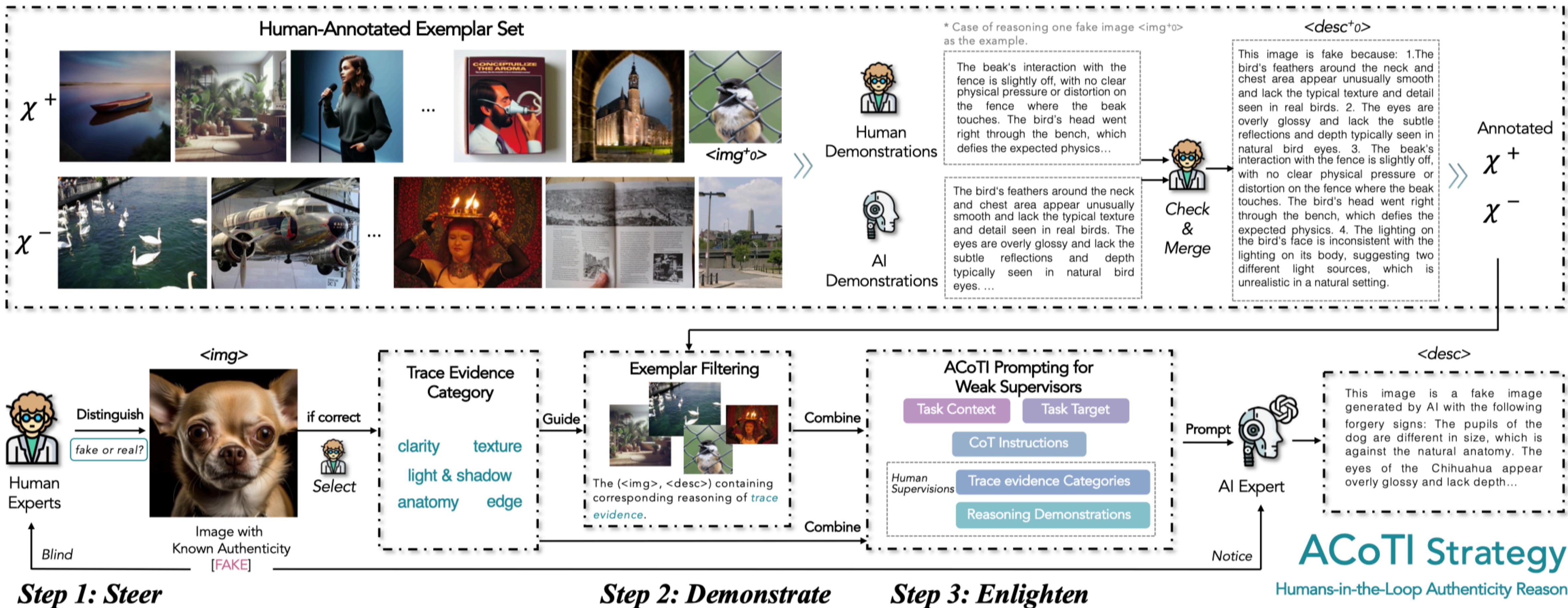


Fig. 2. Contributions of this work. (a) FakeChain dataset, containing long-form reasoning on image authenticity, constructed via the proposed *ACoTI* strategy (Sec. 3); (b) FakeInstruct, containing 2 million visual instructions of image forensic knowledge (Sec. 4); (c) FakeScope model, the expert model for transparent AI-generated image forensics, capable of multi-dimensional forensic capabilities (Sec. 5).

# FakeScope: Large Multimodal Expert Model for Transparent AI-Generated Image Forensics

Yixuan Li, Yu Tian, Yipo Huang, Wei Lu, *Member, IEEE*, Shiqi Wang<sup>†</sup>, *Senior Member, IEEE*, Weisi Lin, *Fellow, IEEE* and Anderson Rocha, *Fellow, IEEE*

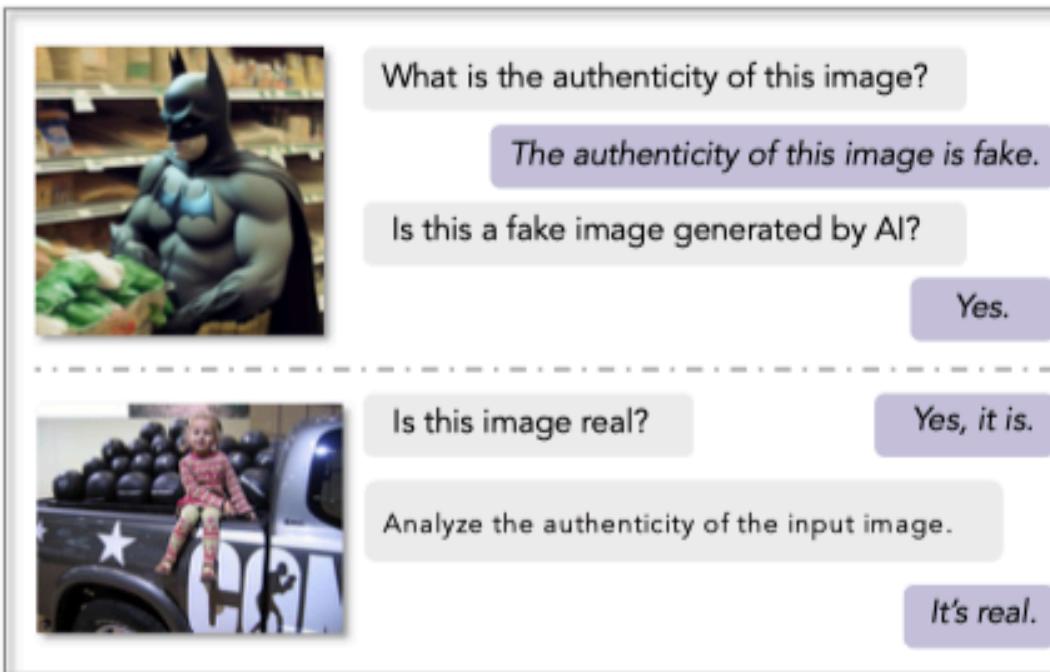
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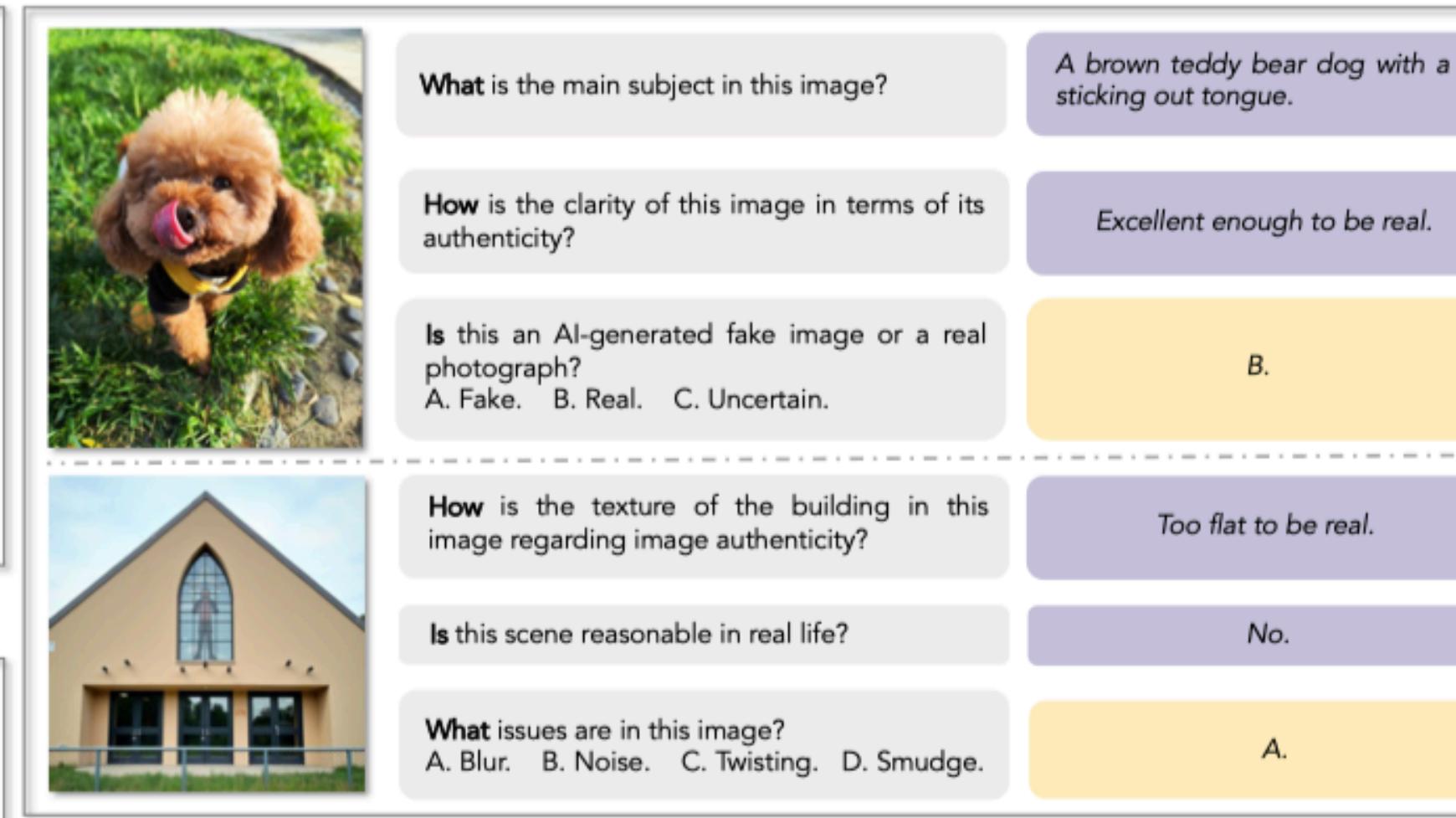
# FakeScope: Large Multimodal Expert Model for Transparent AI-Generated Image Forensics

Yixuan Li, Yu Tian, Yipo Huang, Wei Lu, *Member, IEEE*, Shiqi Wang<sup>†</sup>, *Senior Member, IEEE*, Weisi Lin, *Fellow, IEEE* and Anderson Rocha, *Fellow, IEEE*

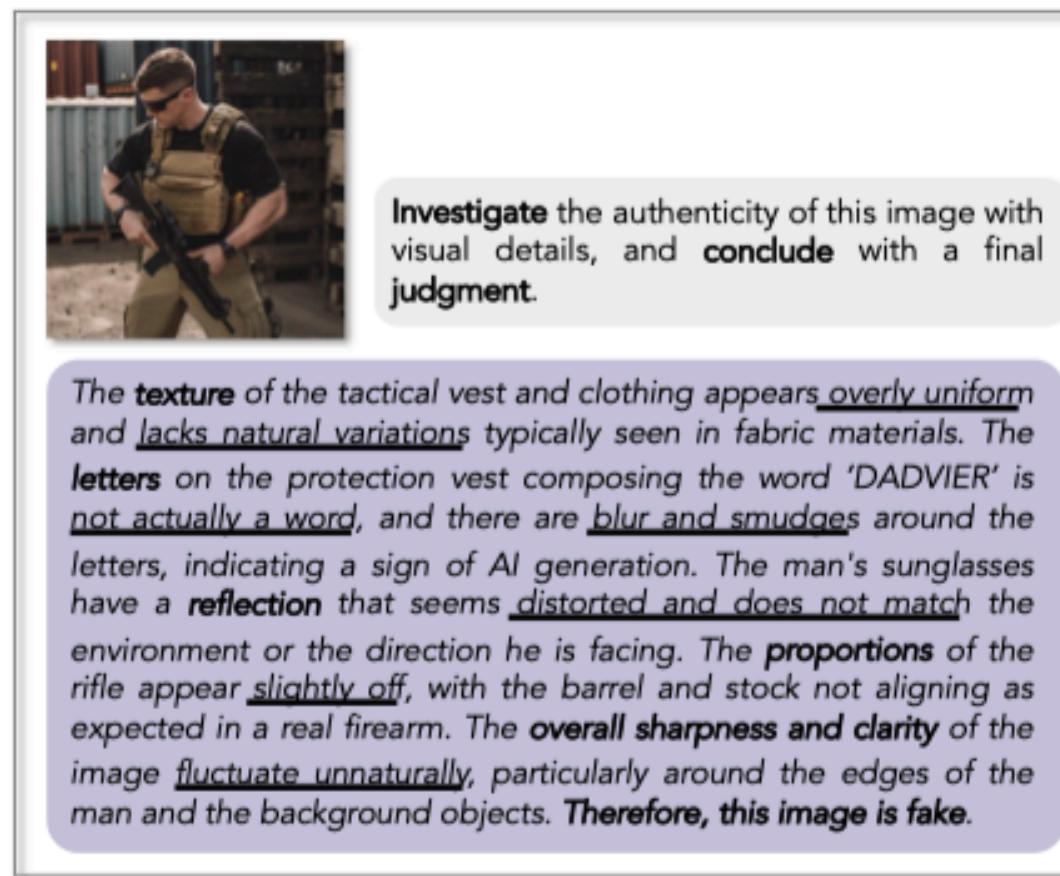
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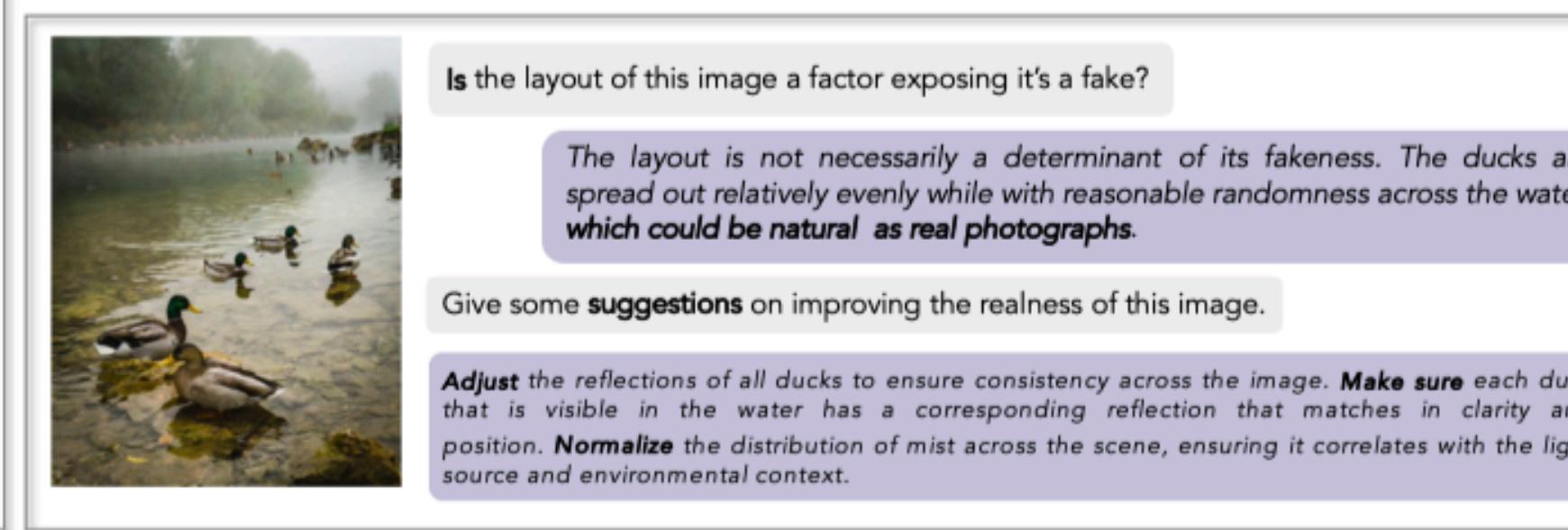
(a) Absolute Judgments



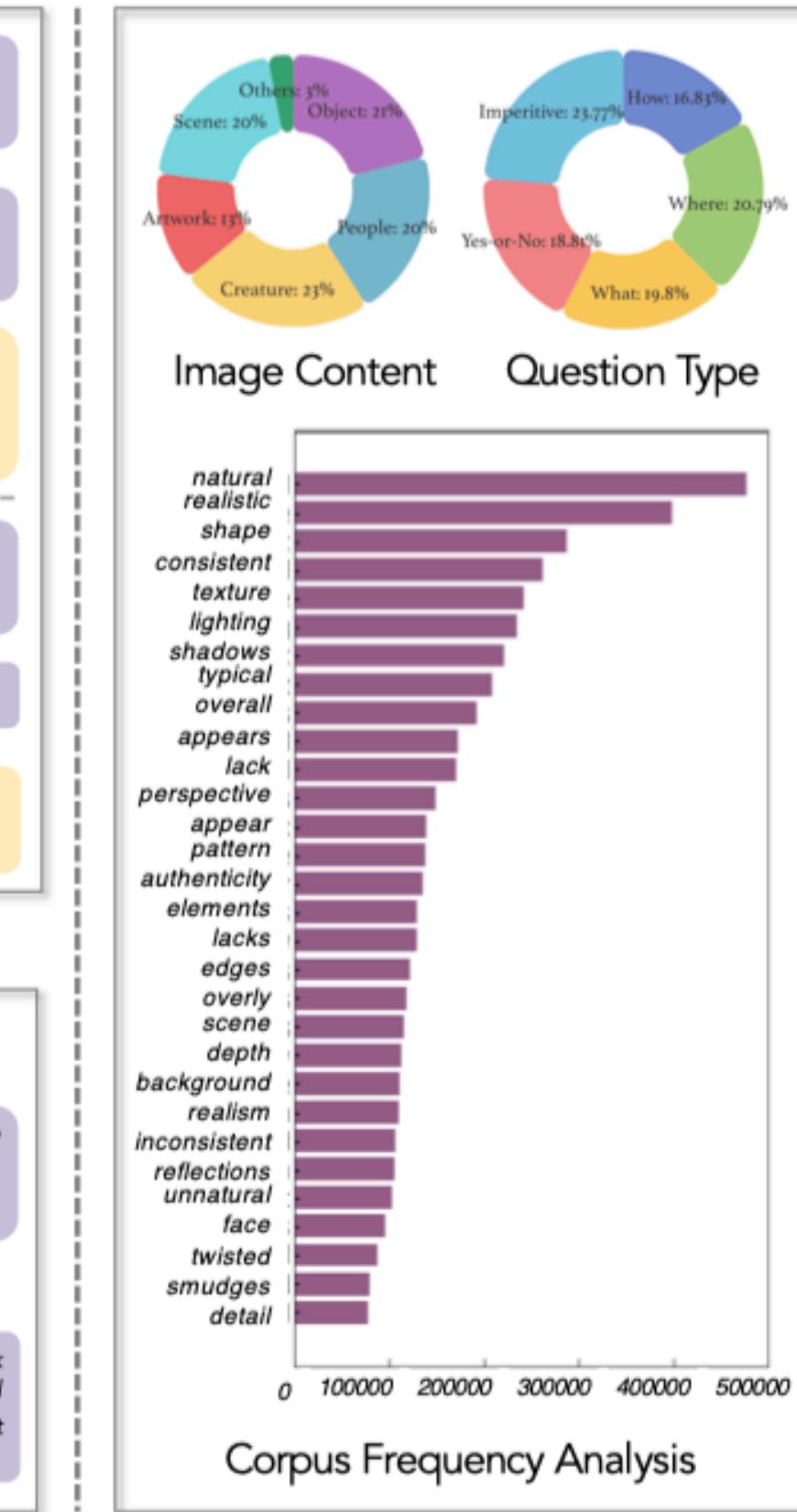
(c) Fine-Grained Trace Evidence



(b) Holistic Reasoning



(d) Extended Knowledge & Discussions



(e) Statistical Visualization

Fig. 4. The composition of the **FakeInstruct**, which is derived from the FakeChain dataset, containing 47K visual instructions on absolute authenticity judgments, 95K instructions on holistic reasoning, 715K on fine-grained visual trace evidence, and 1190K on extended knowledge and discussions. The million-scale diversified visual instructions of FakeInstruct enable LMMs with a broad and fine-grained understanding of image authenticity, ensuring LMMs are equipped to handle diverse forensic tasks with both interpretability and accuracy.





# na ONU

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RECOD.AI NA IEEE TRANSACTIONS...



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PÓS-DOUTORADO: APRENDIZADO ...  
PÓS-DOUTORADO: ENGENHARIA D...

Anderson Rocha  
United Nations Scientific Advisory Board

VEJA MAIS

Recod.ai na IEEE Transactions on Pattern Analysis and Machine Intelligence

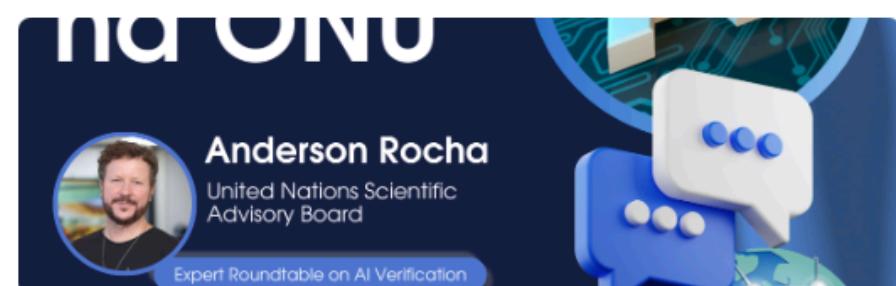
Recod.ai na ONU

Nesta quinta-feira (13), Anderson Rocha, coordenador do Recod.ai e professor do Instituto de Computação -...

Resposta do Recod.ai, em colaboração com especialistas em IA, à pergunta feita por um robô sobre a inteligência artificial.

## Mais notícias

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### NOTÍCIA

#### Recod.ai na ONU

Nesta quinta-feira (13), Anderson Rocha, coordenador do Recod.ai e professor do Instituto...



### ARTIGOS

#### Recod.ai na IEEE Transactions on Pattern Analysis and Machine Intelligence

Pesquisa do Recod.ai,



### OPORTUNIDADE

#### Oportunidade: Pesquisador em IA

Sobre a vagaO  
Recod.ai abre  
chamada para...



### OPORTUNIDADE

#### Pós-Doutorado: Aprendizado de Máquina

Sobre a vagaO  
Recod.ai abre



### OPORTUNIDADE

#### Pós-Doutorado: Engenharia de Petróleo

Sobre a vagaO  
Recod.ai abre



Obrigado!

