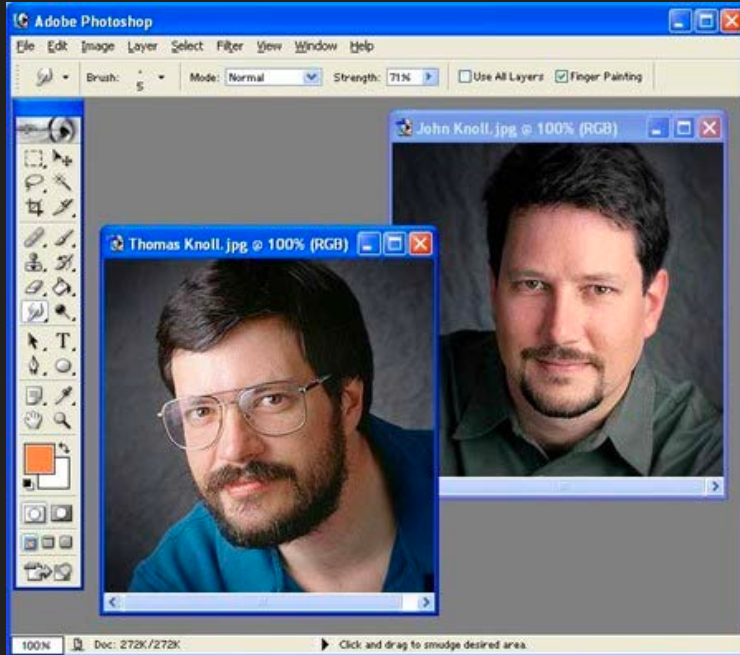




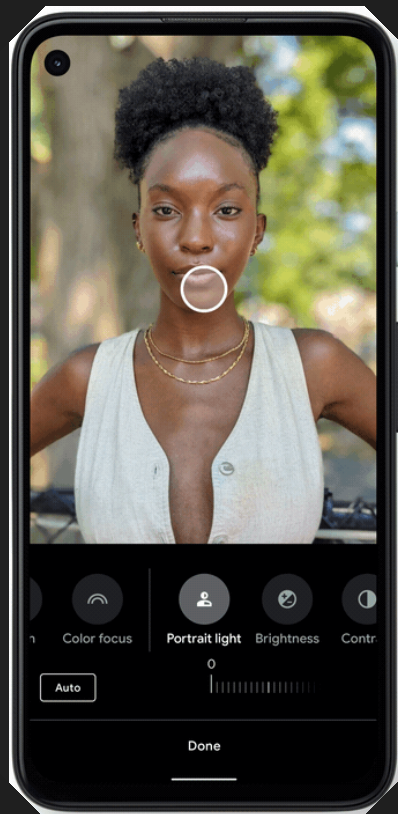
Detecting, Combating, and Identifying Dis- and Mis-information

Chris Bregler, Google Research

Democratization of Media Manipulation



Portrait Lighting (Pixel)



Google Research/DayDream + UCSD:
Sun, Barron, Tsai, Xu, Yu, Fyffe,
Rhemann, Busch, Debevec,
Ramamoorthi + Google Product Team

Google Research / Pixel / Photos:
Pritch, Dorado, Balke, Liba, Talebi,
Kelly, Sarma, Milne, Cai, Chen,
Manoogian, Maffeo, Meron, Wang,
Howard, Eben, Kanazawa,
Movshovitz-Attias, Milanfar,
Campbell, Ma, Ng, Khattar,
Bleibel, Hasinoff

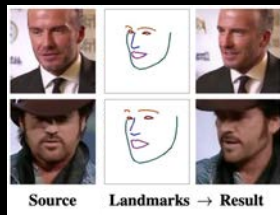
HDR & Sky Palette Transfer



Academic Research / Companies



Thies et al 2016



Zakharov et al 2019



Doukas et al 2021



Synthesia



MyHeritage

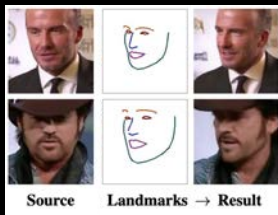


NVIDIA 2021

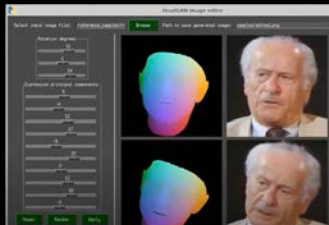
Academic Research / Companies



Thies et al 2016



Zakharov et al 2019



Doukas et al 2021



Synthesia



MyHeritage



NVIDIA 2021



DeepFakes

- Discussed on reddit by anonymous user “/u/deepfakes” in fall 2017
- First public code: Dec-15-2017
- FakeApp in Spring 2018
- Every few days new code

Late Night Live

Deepfakes are coming. Is Big Tech ready?

by Sara Ashlev O'Brien @saraashlev

Deep fakes: Who can you trust?

▶ Listen now

⬇ Download audio

Deepfakes 2.0: The terrifying future of AI and fake news

Simon Chandler — Oct 4 at 10:00PM

Can you tell a fake video from a real one?

US lawmakers are concerned about deepfake technology

Three Representatives have asked the intelligence community for information.

There Is No Tech Solution to Deepfakes

TECH ARTIFICIAL INTELLIGENCE

US lawmakers say AI deepfakes 'have the potential to disrupt every facet of our society'

They're asking the intelligence community to assess the threat from AI video manipulation

Bipartisan trio asks US intelligence to investigate 'deepfakes'

BY ALI BRELAND - 09/13/18 05:28 PM EDT

Rubio warns on 'deep fakes' in disinformation campaigns



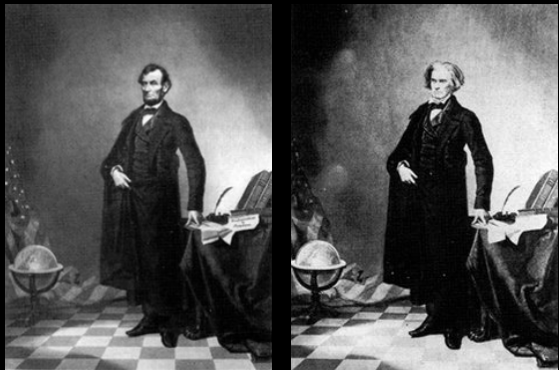
Kaveh Waddell Jul 22

The impending war over deepfakes

BRIEFING • VIDEO

How Faking Videos Became Easy — And Why That's So Scary

Manipulated Media is as old as Invention of Camera





The **open web empowers** anyone anywhere to be a source of information



Google News Initiative: Address this challenge in three ways

Google

We build products to
elevate quality journalism
on our platforms



Newsrooms

We collaborate with
newsrooms to surface
accurate information



Audiences

We support research
and build programs to
improve digital literacy



Verified fact checkers throughout the ecosystem



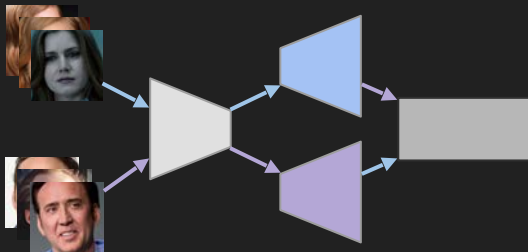
[Feedback](#)



Back to Visual Misinfo / Manipulated Media

Internal Efforts: DeepFakes, CheapFakes

Synthesis:



Pre/Post-2018: internal + opensource

Long History (GAN, VAE, VFX, ...)

Datasets:

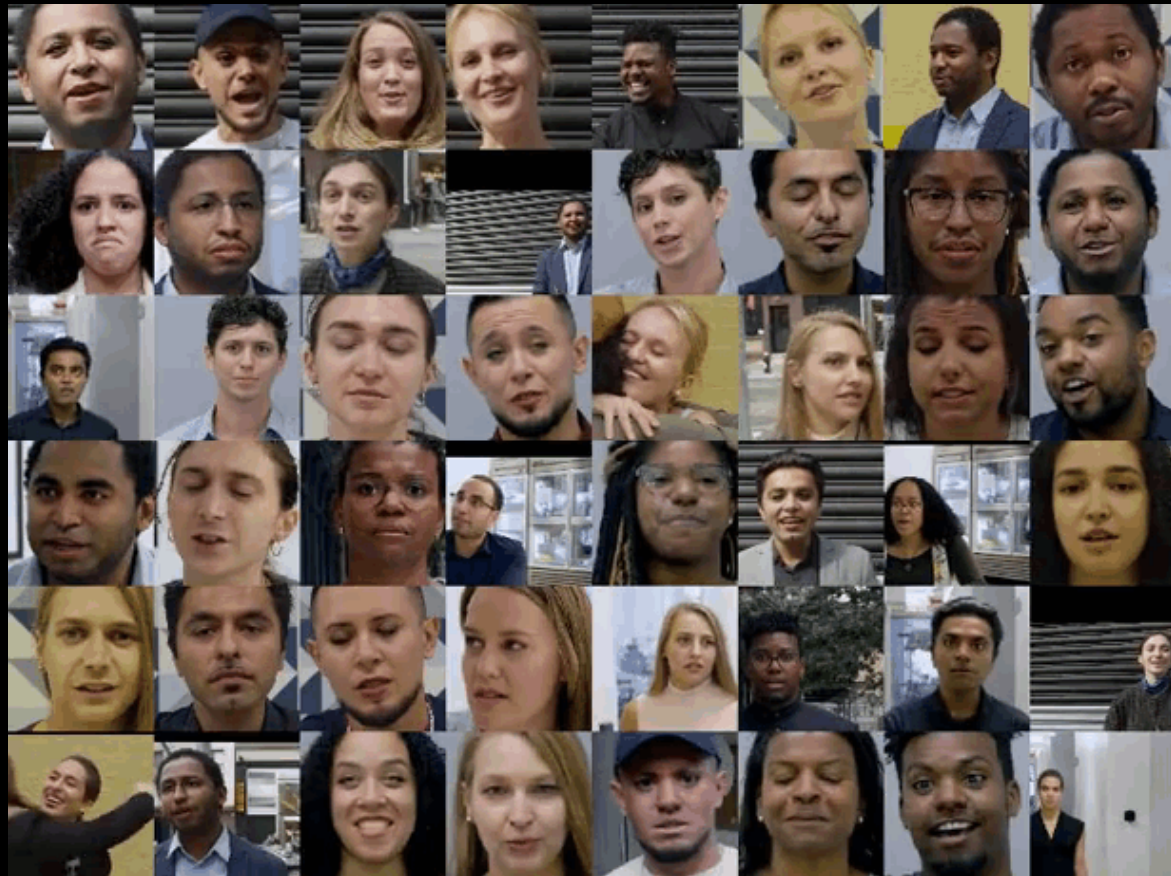


Detectors:

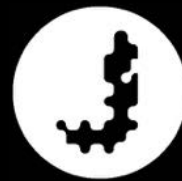


Dufour, Leung, Sud et al. with Verdoliva

Google's DeepFake Detection Data release V1 (with JigSaw)



Technische
Universität
München



TUM



UNIVERSITÀ DEGLI STUDI DI NAPOLI
FEDERICO II

By: Nick Dufour, Andrew Gully, Per
Karlsson, Alexey Victor Vorobyov,
Thomas Leung, Jeremiah "Spudde"
Childs, Christoph Bregler,
With: Andreas Roessler, Davide
Cozzolino, Justus Thies, Luisa
Verdoliva, Matthias Niessner.

Google's DeepFake Detection Data release V1



Audio DeepFakes

GOOGLE NEWS INITIATIVE

Advancing research on fake audio detection

Daisy Stanton

Software Engineer, Google AI

Published Jan 31, 2019

When you listen to Google Maps driving directions in your car, get answers from your Google Home, or hear a spoken translation in Google Translate, you're using Google's speech synthesis, or text-to-speech (TTS) technology. Speech interfaces not only allow you to interact naturally and conveniently with digital devices, they're a crucial technology for making information universally accessible: TTS opens up the internet to millions of users all over the world who may not be able to read, or who have visual impairments.

Over the last few years, there's been an explosion of new research using neural networks to simulate a human voice. These models, including many developed at Google, can generate increasingly realistic, human-like speech.

While the progress is exciting, we're keenly aware of the risks this technology can pose if used with the intent to cause harm. Malicious actors may synthesize speech to try to fool voice authentication systems, or they may create forged audio recordings to defame public figures. Perhaps equally concerning, public awareness of "deep fakes" (audio or video clips generated by deep learning models) can be exploited to manipulate trust in media: as it becomes harder to distinguish real from tampered content, bad actors can more credibly claim that authentic data is fake.

ASVspoof 2019:

Automatic Speaker Verification Spoofing and Countermeasures Challenge

Future horizons in spoofed/fake audio detection

Previous challenges: Find the ASVspoof 2017 website [here](#). Find the ASVspoof 2015 website [here](#).

15th Jan: the ASVspoof 2019 evaluation plan v0.4 is now available ([ChangeLog](#)).

The ASVspoof 2019 registration procedure is described in the evaluation plan. Registrations will be confirmed by email within 48 hours. The registration confirmation email will also contain a link and credentials for the downloading of training and development data.

The ASVspoof 2019 schedule is as follows.

19th December, 2018	Training and development data
8th February, 2019	Participant registration deadline
15th February, 2019	Evaluation data
22nd February, 2019	Scores submission
15th March, 2019	Results
29th March, 2019	Interspeech submission deadline

Informing Users: Jigsaw + Our Research Team

Open question: Even given an oracle, would it be useful?

Jigsaw conducted a UX study using deepfakes generated by our team:



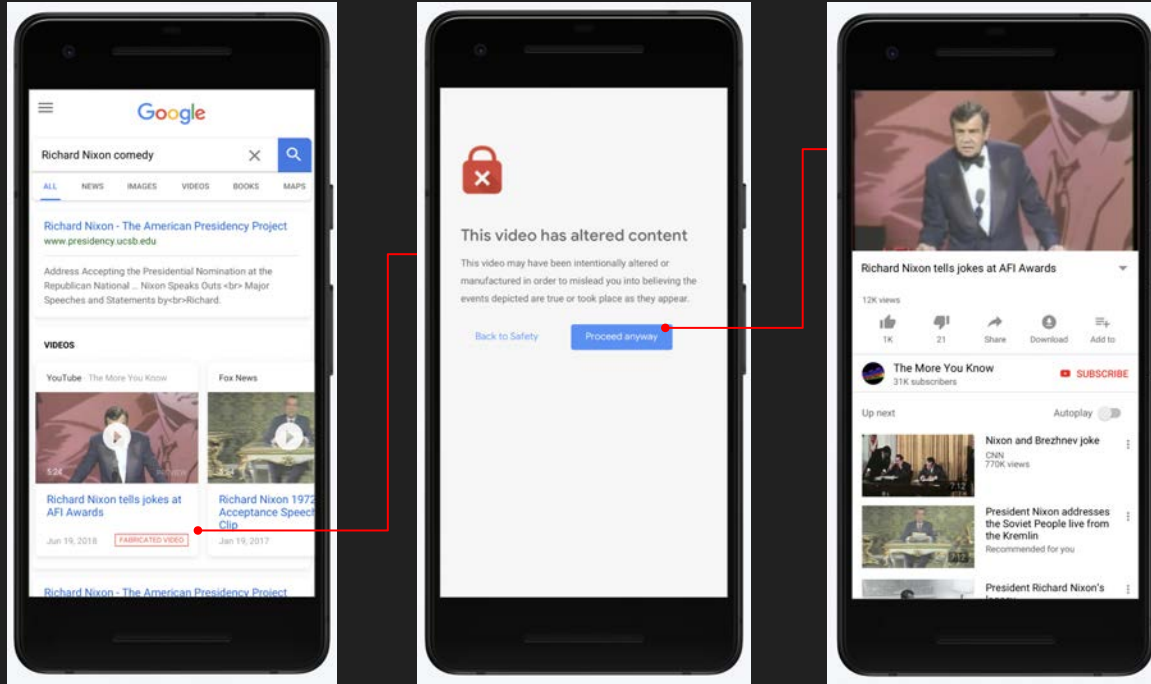
Walter Matthau telling jokes at
AFI Awards (real)



Richard Nixon telling jokes at AFI
Awards (fake)

Informing Users: Jigsaw + Our Research Team

Jigsaw created mockup UI elements and assessed their efficacy ($N=820$)



<https://link.medium.com/AnVgvBetXjb>



¹Chesney & Citron, "Deep Fakes: A Looming Challenge for Privacy, Democracy and National Security"

Liar's Dividend

- Joao Doria, former Sao Paulo mayor, seen in a sex tape 5 days before election.
- He claims it's a deepfake, we (and others) think it's probably authentic.
- Electorate split on whether tape is authentic; Doria wins reelection.
- Example of the Liar's Dividend: "...in what might be understood as a 'liar's dividend,' deep fakes make it easier for liars to avoid accountability for things that are in fact true."¹



¹Chesney & Citron, "Deep Fakes: A Looming Challenge for Privacy, Democracy and National Security"

JigSaw/Google Assembler: Detectors -> Fact Checkers



Naples



Berkeley

(Dartmouth)



JIGSAW



Google AI



Current Academics:

Davide Cozzolino, Giovanni Poggi, Luisa Verdoliva, Minyoung Huh, Andrew Liu, Andrew Owens, Ayosha Efros, Shruti Agarwal, Hany Farid, Peng Zhou, Xinton Han, Vlad Morariu, Abhinav Shrivastava, Larry Davis

Jigsaw + Google AI Team

Special Thanks to:
NIST + DARPA



Ensemble Model
Jigsaw

MODEL PREDICTION ⓘ

Very likely manipulated

91% chance of manipulation

CONTRIBUTING DETECTORS:



Self-Consistency Splice
UC Berkeley



Splicebuster
University Federico II of Naples



Dense-Field Copy-Move
University Federico II of Naples



Color & Noise Patterns
University of Maryland



JPEG Dimples
UC Berkeley

Best detects: **Reformatting** in images.
[Learn more](#)



StyleGAN Detector
Jigsaw



Add your detector



Heatmap On



100%



Likelihood of Anomaly

LOWEST

LOW

MED

HIGH

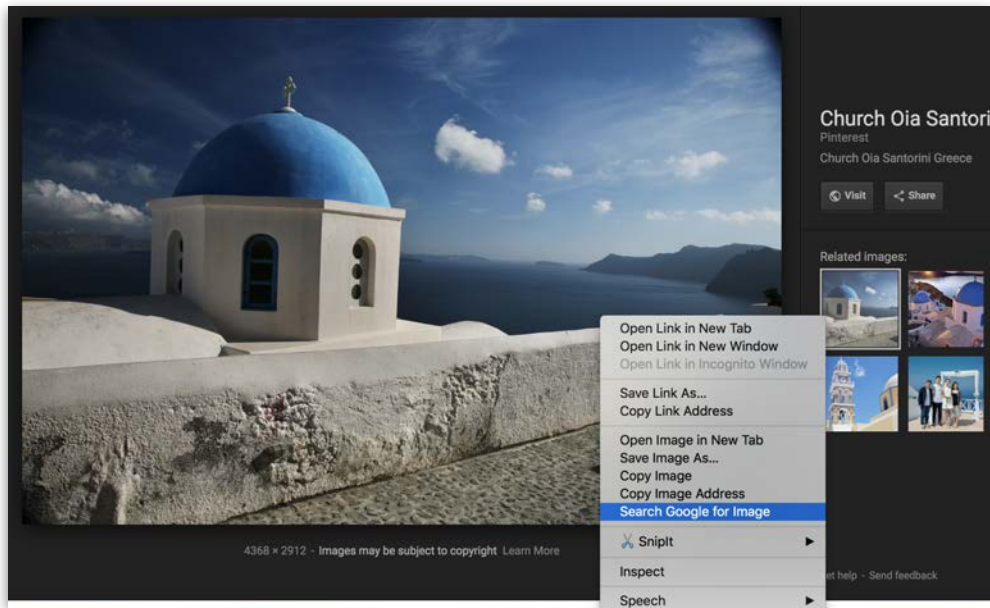
HIGHEST



Google's Media Integrity Efforts

- Google News Initiative
- Fact Checking via ClaimReview/MediaReview
- Deepfake (audio + video) datasets
- CheapFakes/DeepFakes -> FactCheck/Journalists
- Provenance: GRIS
- Misleading / False Context
- Other research efforts

How to use Google Reverse Image Search (GRIS)?



1. Chrome: right-click on the image
2. Select "Search Google for Image"



Paul Watson
@paulmwatson



Before you RT a **#Turkey** photo do a Google Image Search. Easy even on mobile.

Taksim square **#Turkey** right now



15/07/2016, 23:15

881 RETWEETS 338 LIKES

RETWEETS
1,911

LIKES
1,340



3:58 PM - 15 Jul 2016

1.9K 1.3K



#Turkey - July 15, 2016

#Moroco - Nov 1, 2015



VERIFY: The truth behind Ovechkin in the 'Never Kneel' shirt pic

“QUESTION: Did Alex Ovechkin wear a licensed Capitals shirt that says "Never Kneel?"

ANSWER: No, this photo is not legit.

SOURCES: Google Reverse Image Search”



VERIFY: The truth behind Ovechkin in the 'Never Kneel' shirt pic

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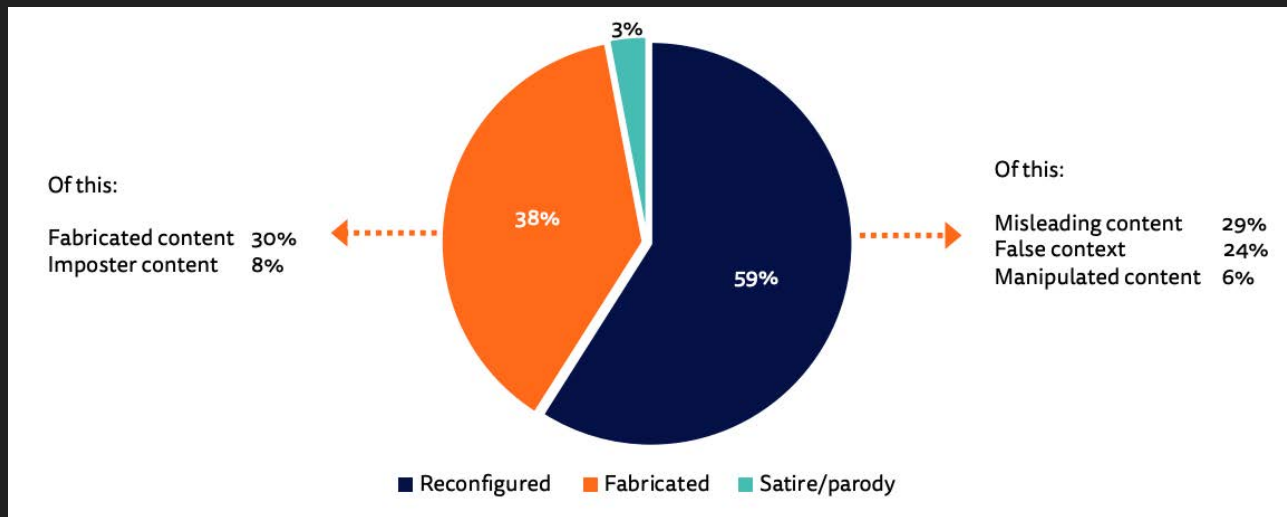
SOURCES: Google Reverse Image Search



Oxford Reuters Institute

Types, Sources, and Claims of COVID-19 Misinformation

Authors: J. Scott Brennen, Felix M. Simon, Philip N. Howard, and Rasmus Kleis Nielsen



Grand Challenge on

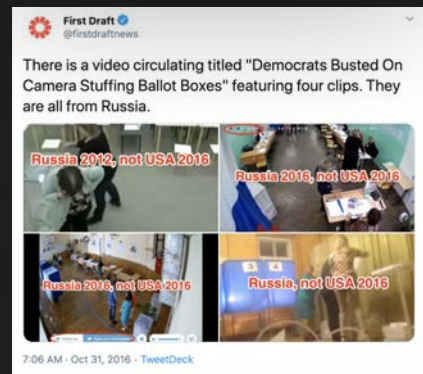
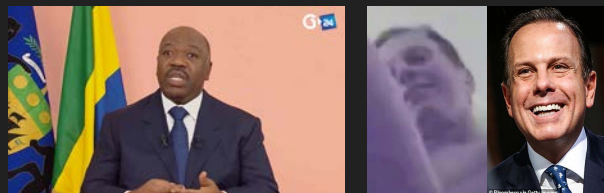
Detecting Cheapfakes

Organized and sponsored by



simulamet





DeepFakes, Liar's Dividend

CheapFakes: Doctoring, Editing

CheapFakes: Change Context

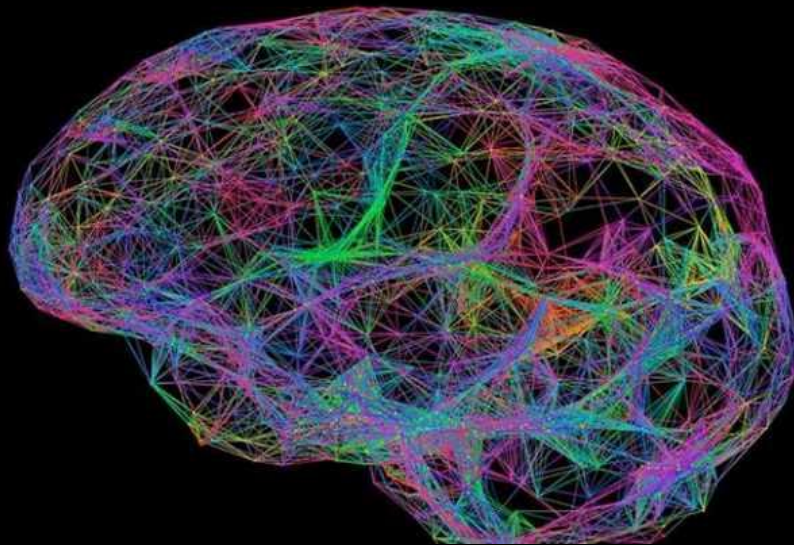
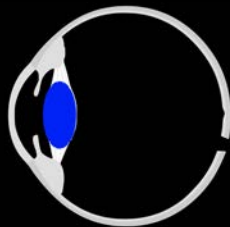
Fake Media \neq Fake News

Most manipulations with DeepFakes or PhotoShop is innocent, for entertainment, or parody.

Malicious intent or real-world harm
-> Disinformation

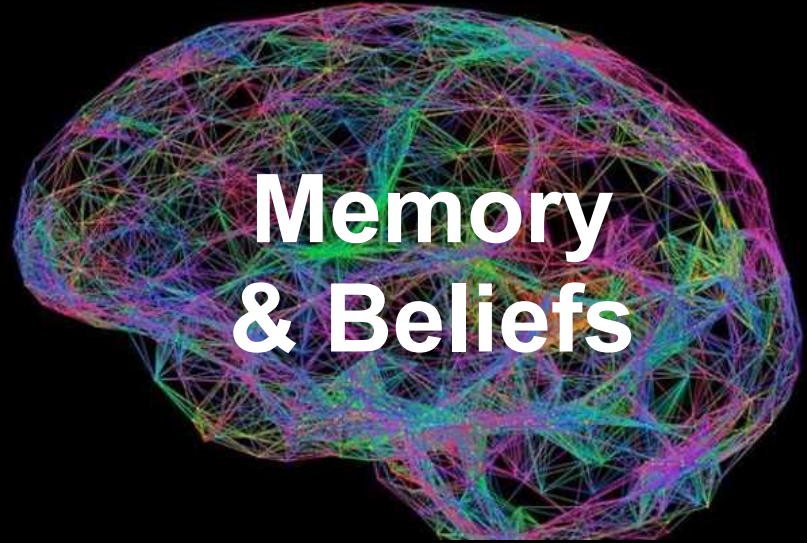
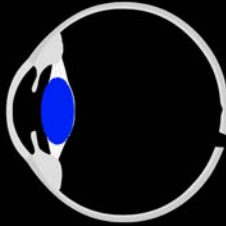
Deciding what is mis/disinformation is a human task

World \rightarrow Sensor \rightarrow Truth ?



50,000 years of *Post-Truth*

Story Telling



No Silver Bullet: Multidisciplinary Effort

