



Responsible AI

A short introduction for
a general audience

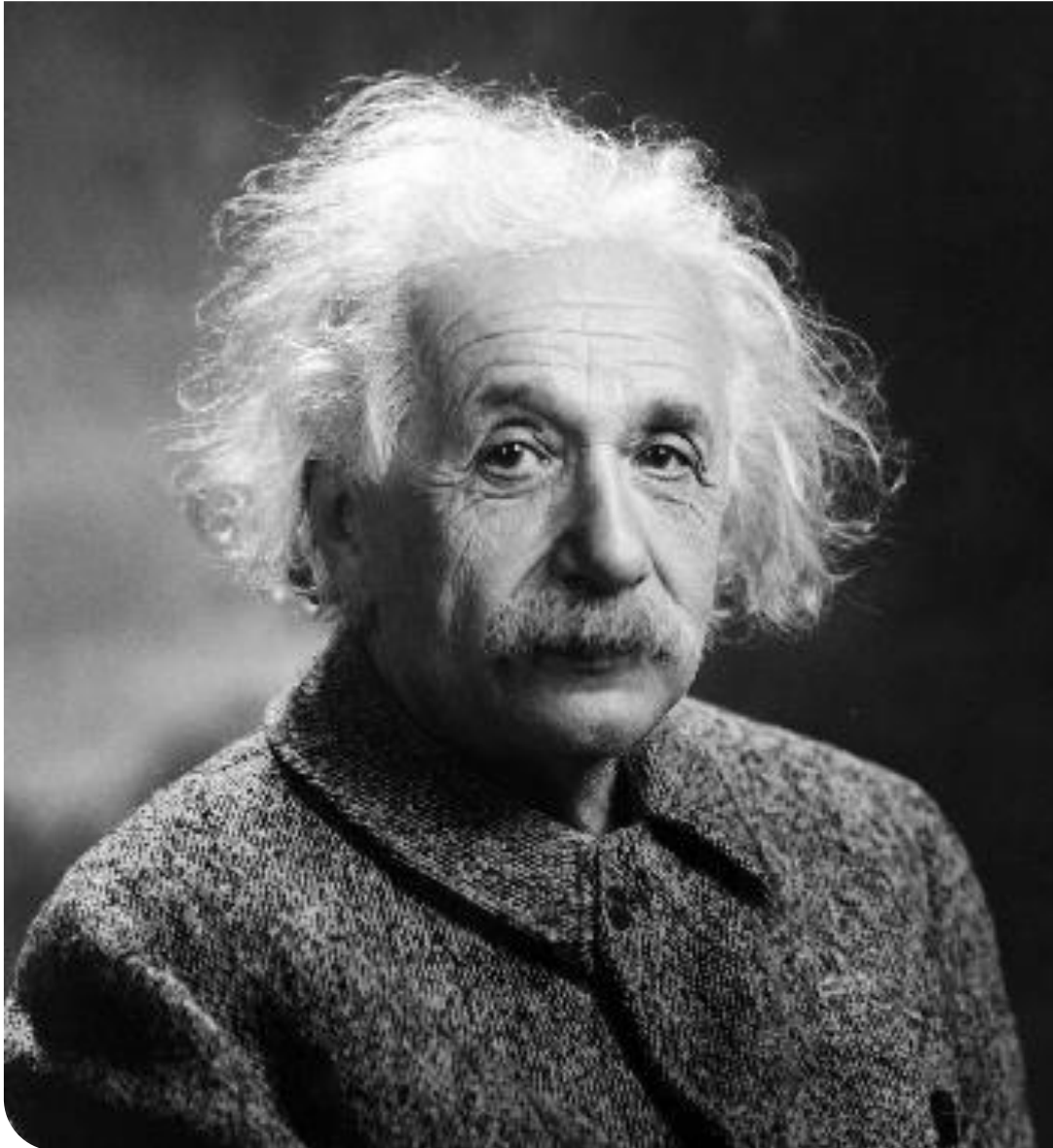
Prof. David Martens

Co-director ACRAI
Antwerp Center for Responsible AI

Nov 2023



Universiteit
Antwerpen



Einstein's Warning

"Technological progress is like an axe in the hand of a pathological criminal."

The age of AI

Dermatologist-level classification of skin cancer with deep neural networks

[Andre Esteva](#) ✉, [Brett Kuprel](#) ✉, [Roberto A. Novoa](#) ✉, [Justin Ko](#), [Susan M. Swetter](#), [Helen M. Blau](#) & [Sebastian Thrun](#) ✉

Nature 542, 115–118 (2017) | [Cite this article](#)

187k Accesses | 4797 Citations | 2936 Altmetric | [Metrics](#)

The economic potential of generative AI: The next productivity frontier

June 14, 2023 | Report

‘It will change everything’: DeepMind’s AI makes gigantic leap in solving protein structures

Google’s deep-learning program for determining the 3D shapes of proteins stands to transform biology, say scientists.


GatesNotes



A NEW ERA


The Age of AI has begun

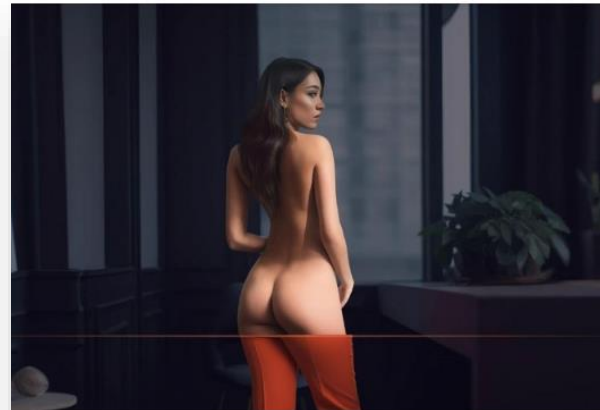
By Bill Gates | March 21, 2023 • 14 minute read

The age of AI?

Default (GPT-3.5) 

 Is 270 90% van 300? 

 No, 270 is 90% of 300. To find 90% of 300, you multiply 300 by 0.90, which equals 270.








Spaanse tienermeisjes werden in hun blootje gezet met de app Clothoff. - © Clothoff

DEEPFAKE-SCHANDAAL




Spaanse tieners afgeperst met 'superrealistische' valse naaktbeelden

Toen ze na de zomervakantie weer naar school gingen, ontvingen ruim twintig meisjes uit het Zuid-Spaanse dorp Almendralejo valse naaktfoto's van zichzelf. Ze zagen er 'griezelig echt' uit. 'Mijn dochter walgt van zichzelf.'

13:39  29%

  'He Would Still Be Here': Ma...  
vice.com


+ ENGLISH




  



MOTHERBOARD
TECH BY VICE




'He Would Still Be Here': Man Dies by Suicide After Talking with AI Chatbot, Widow Says

The incident raises concerns about guardrails around quickly-proliferating conversational AI models.

 By [Chloe Xiang](#)

March 30, 2023, 9:59pm   

 Listen to this article


Machine Learning

- **Machine Learning:** automatic extraction of knowledge from data
- Setting the scene with credit scoring example

Client	Income	Sex	Amount	Default
A	1.600	M	175.000	N
B	2.600	F	350.000	Y
C	3.280	M	50.000	N
D	950	M	120.000	Y
E	10.500	M	1.000.000	N
F	5.700	F	240.000	N
G	2.400	F	250.000	N

Data

Machine Learning

Machine learning technique

Classification Model
if income < 10.000 and Amount Loan > 100.000 and ... then default = yes

Pattern

Client	Income	Sex	Amount	Default
New client	2.000	F	500.000	Y

Recommender Systems

NETFLIX Browse Kids DVD

Because you watched New Girl

how i met your mother LOVE FRIENDS JANE VIRG

TV Mysteries LEVERAGE NCIS

Irreverent TV Shows

Targeted Advertising



Many more ...

Frequently Bought Together



Total List Price: \$225.90
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- This item: Introduction to Data Mining by Pang-Ning Tan
- Data Mining: Practical Machine Learning Tools and Techniques, Second Edition (The Morgan Kaufmann Series in Data Management Systems) by Ian H. Witten
- Data Mining: Concepts and Techniques, Second Edition (The Morgan Kaufmann Series in Data Management Systems) by Micheline Kamber Jiawei Han



Fraud Detection





You

What are the 5 most important applications of AI, ranked by the impact on citizens. Max. one line per application.



ChatGPT

1. **Healthcare:** AI improves diagnosis accuracy, personalized treatment plans, and disease prediction, significantly enhancing patient outcomes.
2. **Environmental Protection:** AI aids in climate change analysis, conservation efforts, and sustainable resource management, safeguarding our planet.
3. **Education:** Personalized learning experiences and enhanced accessibility, improving education quality and availability globally.
4. **Transportation:** Autonomous vehicles and traffic management systems reduce accidents, congestion, and pollution, transforming urban mobility.
5. **Economic Development:** AI-driven automation and data analysis enhance productivity, innovation, and job creation across industries.



JA

You

Make an image of the happiest Belgian alive.





You

Make an image of a little ghost on a Thalys train.



Responsible AI

The development and application of AI that is aligned with moral values of society

AI Risks



Immediate

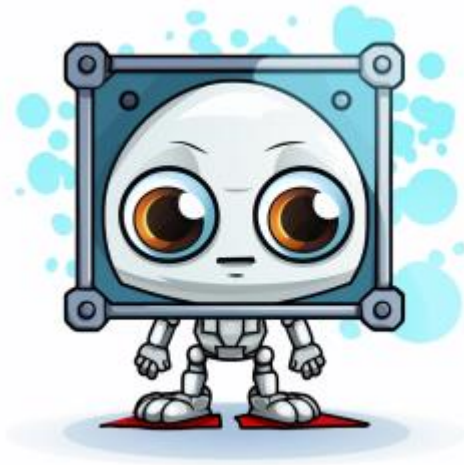


Systemic



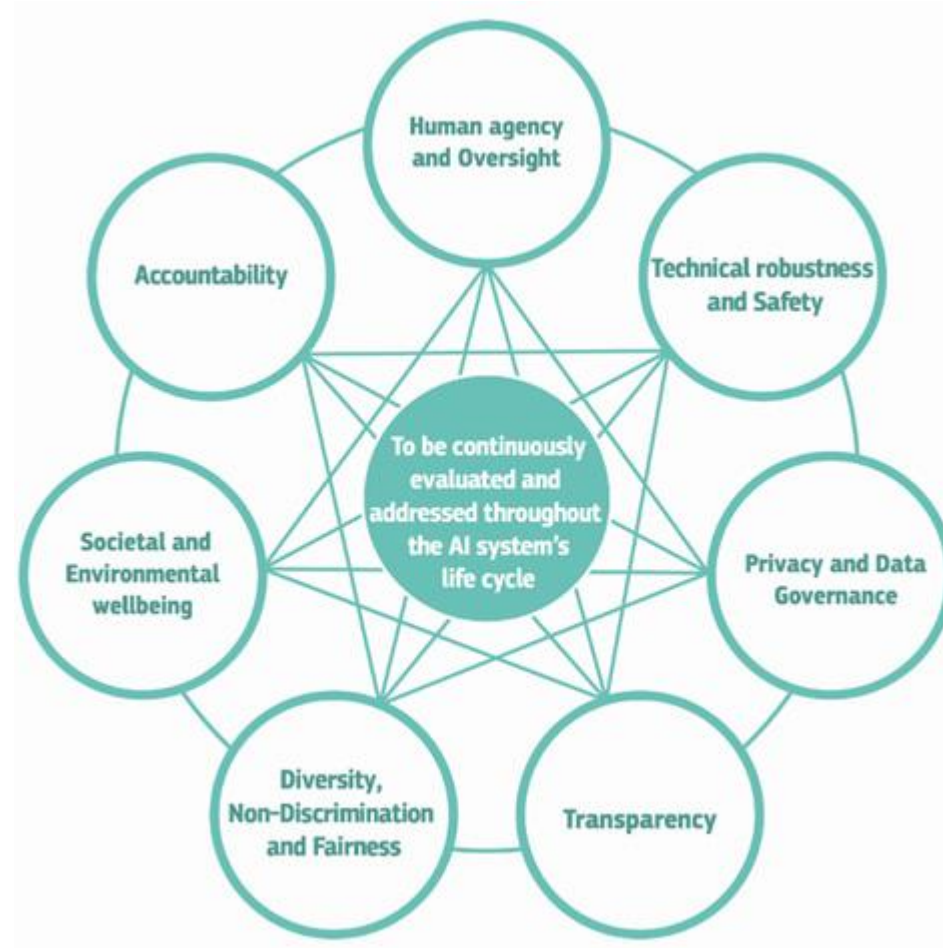
Long term

AI Risks



Immediate

A selection follows next.



Europe's Ethics Guidelines for Trustworthy AI (2019)

1. Explainable AI



DHH ✓
@dhh

Volgen

Apple co-founder Steve Wozniak says Apple Card discriminated against his wife

By Clare Duffy, CNN Business
Updated 16:15 GMT (00:15 HKT) November 11, 2019

The [@AppleCard](#) is such a fucking sexist program. It returns state time. I think it does

12:34 - 7

9.664 ret

1.585



why, but I swear we're not discriminating, IT'S JUST THE ALGORITHM". I shit you not. "IT'S JUST THE ALGORITHM!".

69 542 4.253



Financial Services is looking into the Apple Card, which is administered by

credit card accounts or any on Twitter, in reply to

direction though. It's big tech

Black Box?

- Deep learning: large artificial neural network with massive number of parameters
 - MobileNetV2: 4.3 million parameters
 - GPT-4: >1 trillion parameters (an image of a printed version of the formula...)



Trust: lab-setting versus real-life

- Data: image of skin lesion
- Task: diagnose skin cancer
- High test accuracy, matching accuracy of 21 dermatologists

[HTML] **Dermatologist-level classification of skin cancer with deep neural networks**

[A Esteva](#), [B Kuprel](#), [RA Novoa](#), [J Ko](#), [SM Swetter](#)... - nature, 2017 - nature.com

... of **deep learning** in dermatology, a technique that we apply to both general **skin** conditions and specific **cancers**. Using a single ... to **classify skin** lesions. The result is an algorithm that can ...

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Trust: lab-setting versus real-life

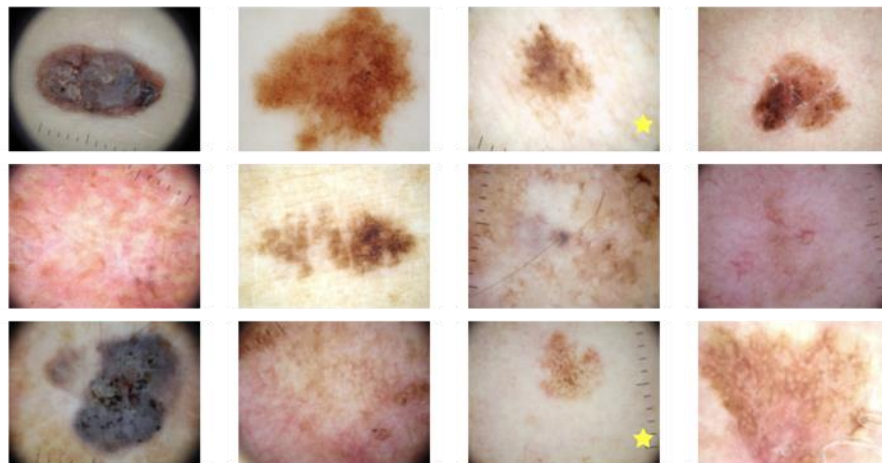
- Data: image of skin lesion
- Task: diagnose skin **cancer**
- High test accuracy, matching accuracy of 21 dermatologists
- Issue: when dermatologist is concerned about lesion, a ruler is placed next to it in the picture
- Pattern learnt?: if ruler then malignant (authors stated ruler had limited impact)

[HTML] [Dermatologist-level classification of skin cancer with deep neural networks](#)

[A Esteva](#), [B Kuprel](#), [RA Novoa](#), [J Ko](#), [SM Swetter](#)... - nature, 2017 - nature.com

... of **deep learning** in dermatology, a technique that we apply to both general **skin** conditions and specific **cancers**. Using a single ... to **classify skin** lesions. The result is an algorithm that can ...

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Trust: lab-setting versus real-life

- Data: picture
- Task: predict if **horse** or not
- High test accuracy, low accuracy when deployed in the field
- Issue: horse pictures had watermark with copyright at bottom left
- Pattern learnt: if watermark then horse



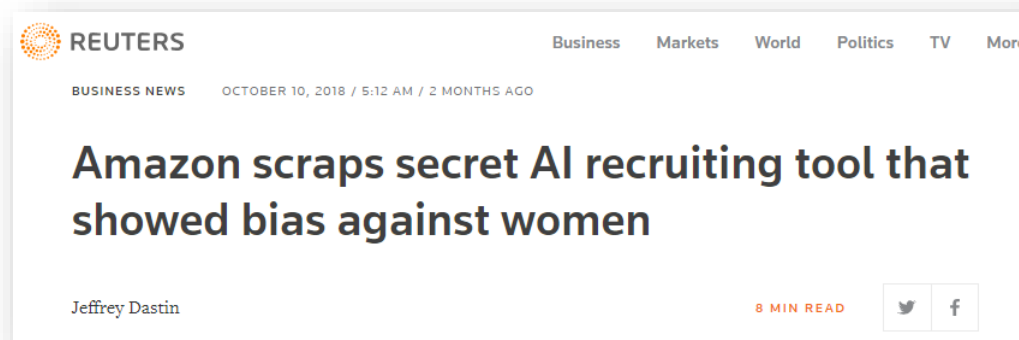
<https://arxiv.org/pdf/1902.10178.pdf>

2. Fairness

- Discrimination against sensitive groups
- Bias

2. Fairness

- Discrimination against sensitive groups
- Bias
 - HR Analytics, prediction model to review job applicants' resumes to automate the search for top talent
 - Trained on resumes from past (10 year period), biased data
 - Model trained to prefer male candidates, for example:
 - Penalized uses of word “woman’s” (eg woman’s chess club president)
 - Penalizes all-woman colleges



Clinical use of current polygenic risk scores may exacerbate health disparities

[Alicia R. Martin](#) , [Masahiro Kanai](#), [Yoichiro Kamatani](#), [Yukinori Okada](#), [Benjamin M. Neale](#) & [Mark J. Daly](#)



*“Although we share enthusiasm about the potential of PRS to improve health outcomes through their eventual routine implementation as clinical biomarkers, we consider the consistent observation that they currently have **far greater predictive value** in individuals of **recent European descent** than of other ancestries to be the major ethical and scientific challenge surrounding clinical translation and, at present, the **most critical limitation to genetics in precision medicine.**”*

3. Experimentation

- Ethics as an afterthought...
- We should be mindful of experiments on our children



The Washington Post
Democracy Dies in Darkness

HELP DESK [What's New](#) [Tech in Your Life](#) [Future of Work](#) [Your Data and Privacy](#) [Internet Access](#) [Ethical Issues](#) [Ask a Question](#)

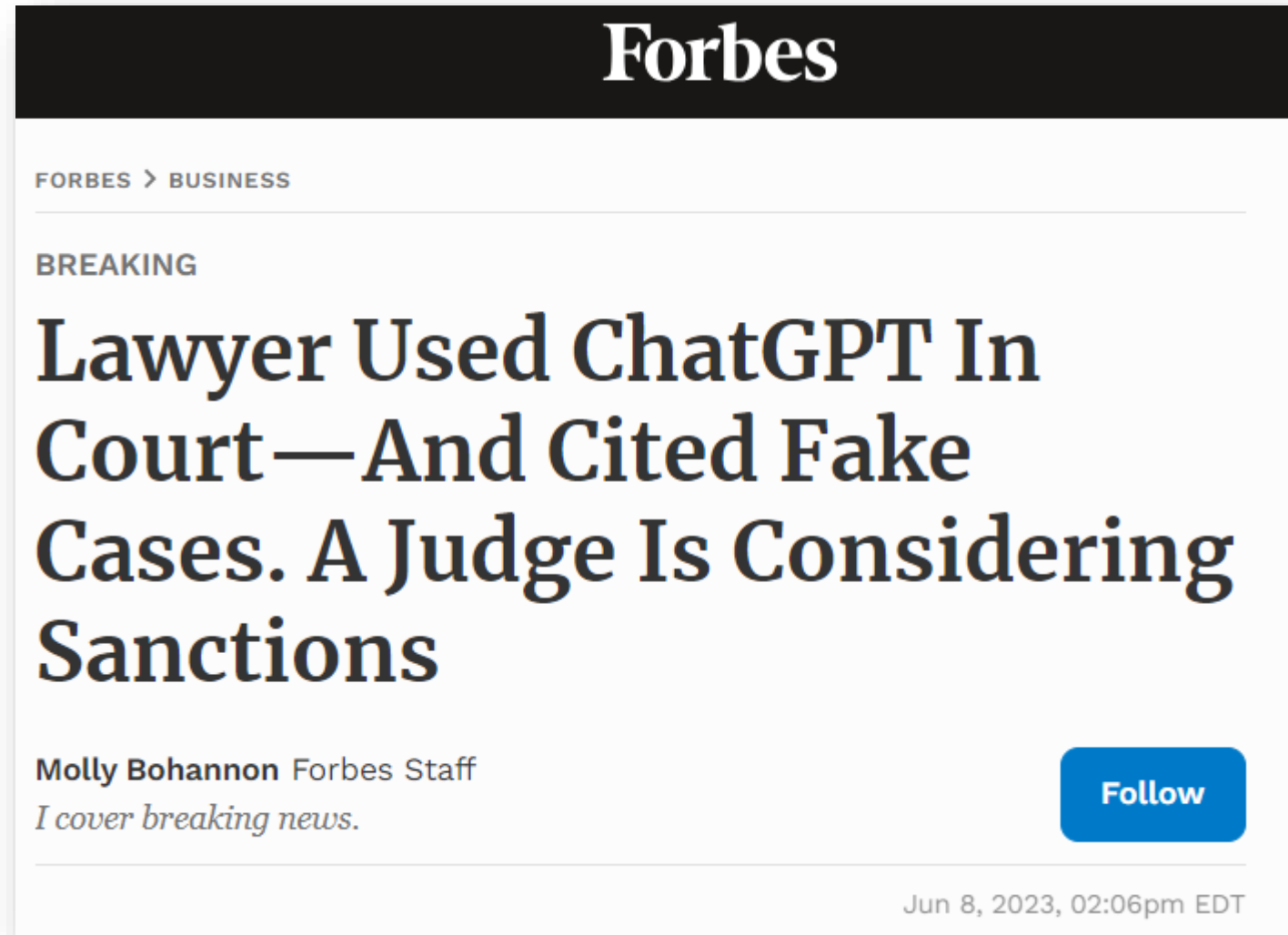
WHAT'S NEW

Snapchat tried to make a safe AI. It chats with me about booze and sex.

Our tech columnist finds Snapchat can't control its new My AI chatbot friend. Tech companies shouldn't treat users as test subjects — especially young ones.

4. Generative AI risks

- Hallucinations



The image shows a screenshot of a Forbes article. At the top, the Forbes logo is displayed in white on a black background. Below the logo, the text 'FORBES > BUSINESS' is visible. The article is marked as 'BREAKING'. The main headline reads: 'Lawyer Used ChatGPT In Court—And Cited Fake Cases. A Judge Is Considering Sanctions'. The author is identified as 'Molly Bohannon Forbes Staff' with a bio: 'I cover breaking news.' A blue 'Follow' button is located to the right of the author's name. At the bottom right of the article preview, the date and time 'Jun 8, 2023, 02:06pm EDT' are shown.

Forbes

FORBES > BUSINESS

BREAKING

Lawyer Used ChatGPT In Court—And Cited Fake Cases. A Judge Is Considering Sanctions

Molly Bohannon Forbes Staff
I cover breaking news.

[Follow](#)

Jun 8, 2023, 02:06pm EDT

Is 270 90% of 300?

✓ Generating answers for you...



Your personal and company data are protected in this chat

No, 270 is not 90% of 300. To find out what percentage of 300 is 270, we can use the following formula:

$$\text{percentage} = \frac{\text{part}}{\text{whole}} \times 100$$

In this case, the part is 270 and the whole is 300. So, we can plug in these values and simplify:

$$\text{percentage} = \frac{270}{300} \times 100$$

$$\text{percentage} = 0.9 \times 100$$

$$\text{percentage} = 90$$

Therefore, 270 is **90%** of 300.

Alternatively, we can use the inverse of the formula to find out what number is 90% of 300:

$$\text{part} = \frac{\text{percentage}}{100} \times \text{whole}$$

In this case, the percentage is 90 and the whole is 300. So, we can plug in these values and simplify:

$$\text{part} = \frac{90}{100} \times 300$$

$$\text{part} = 0.9 \times 300$$

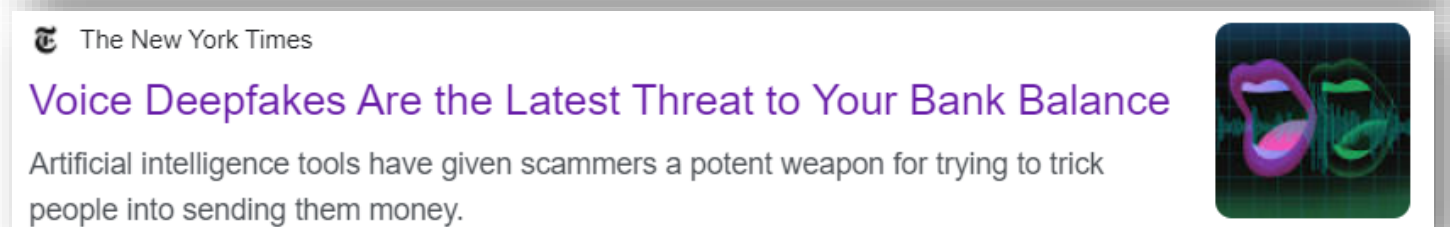
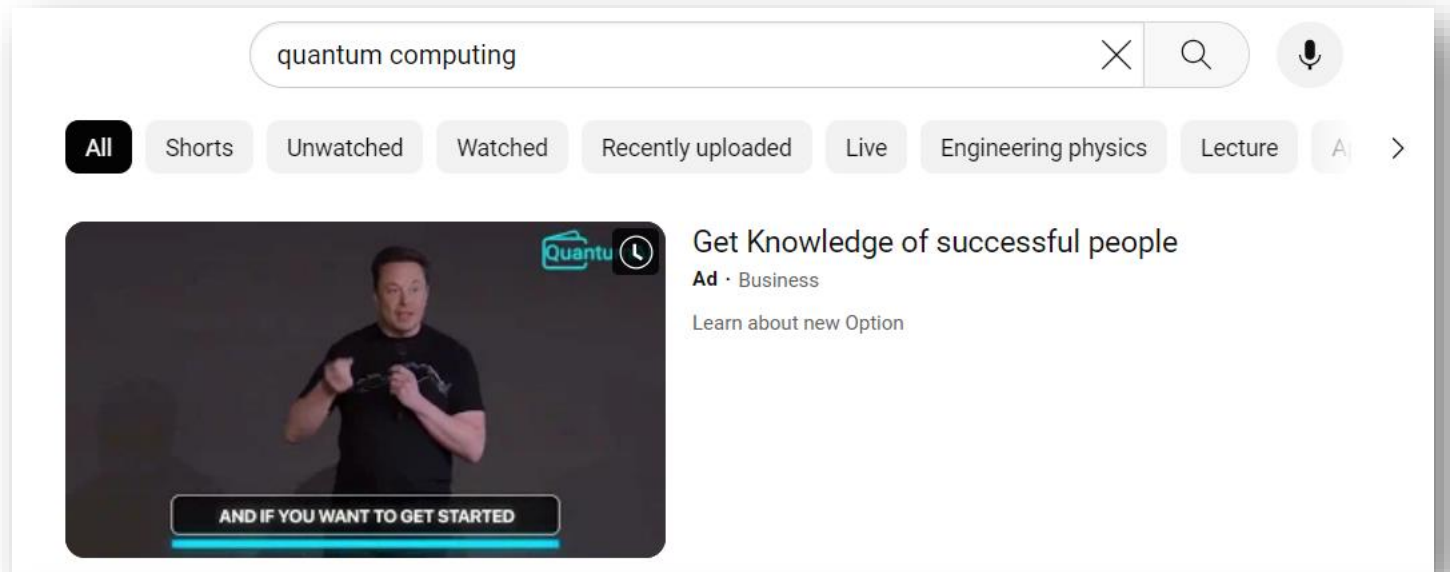
$$\text{part} = 270$$

Therefore, **270** is 90% of 300.

I hope this helps you understand how to calculate percentages. 😊

Generative AI risks

1. Hallucinations
2. Misuse

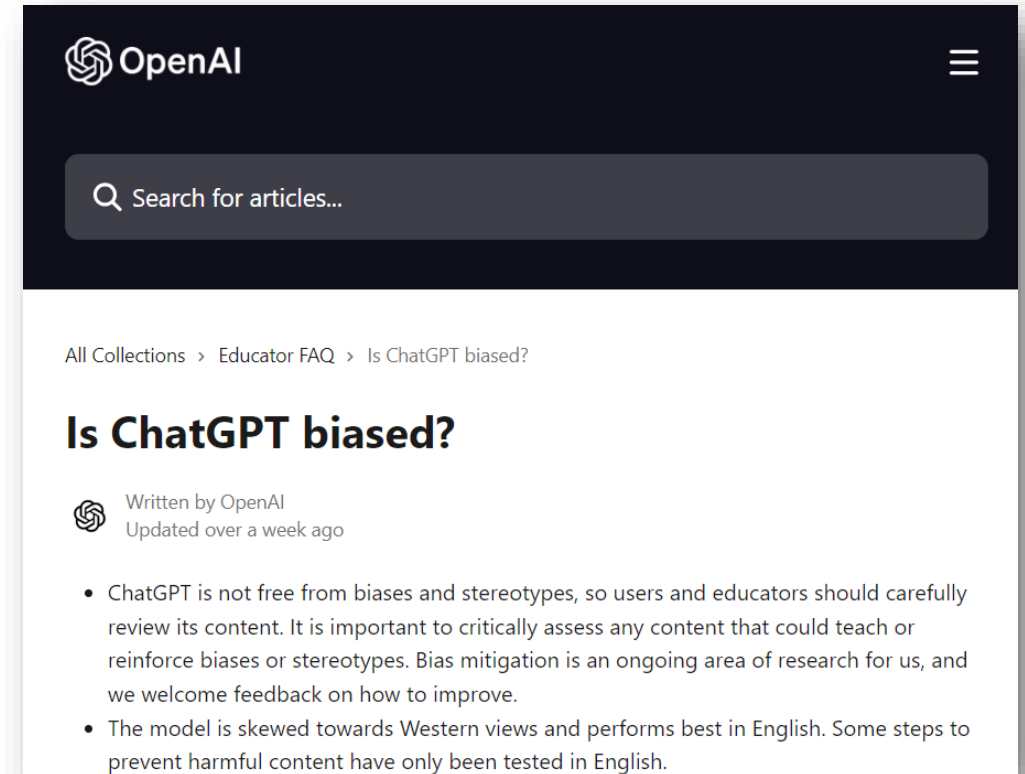


Generative AI risks

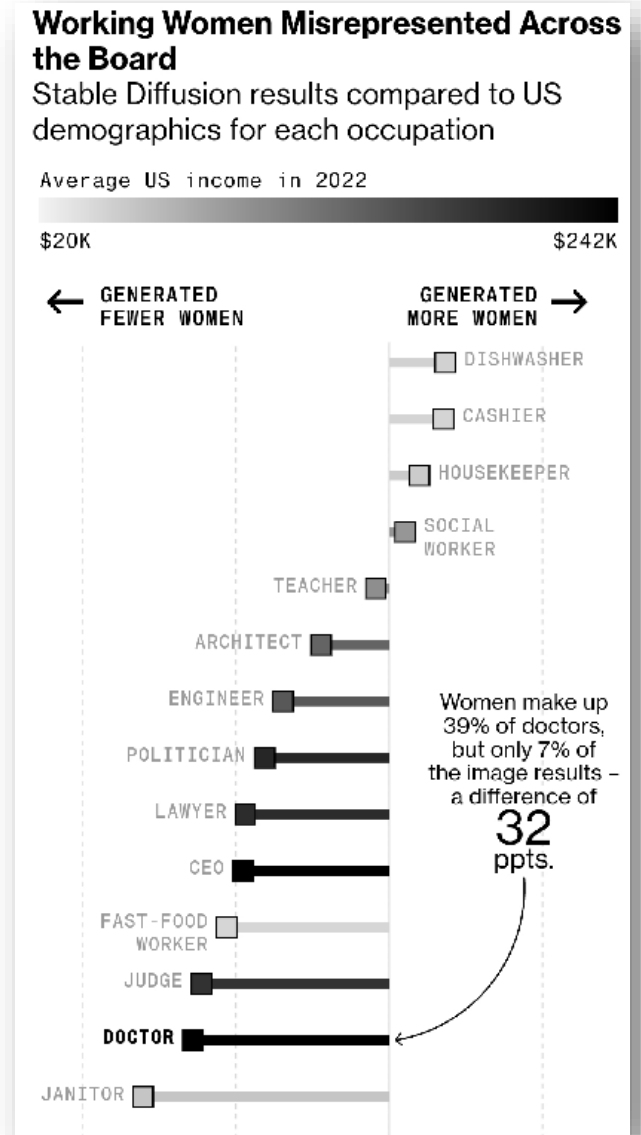
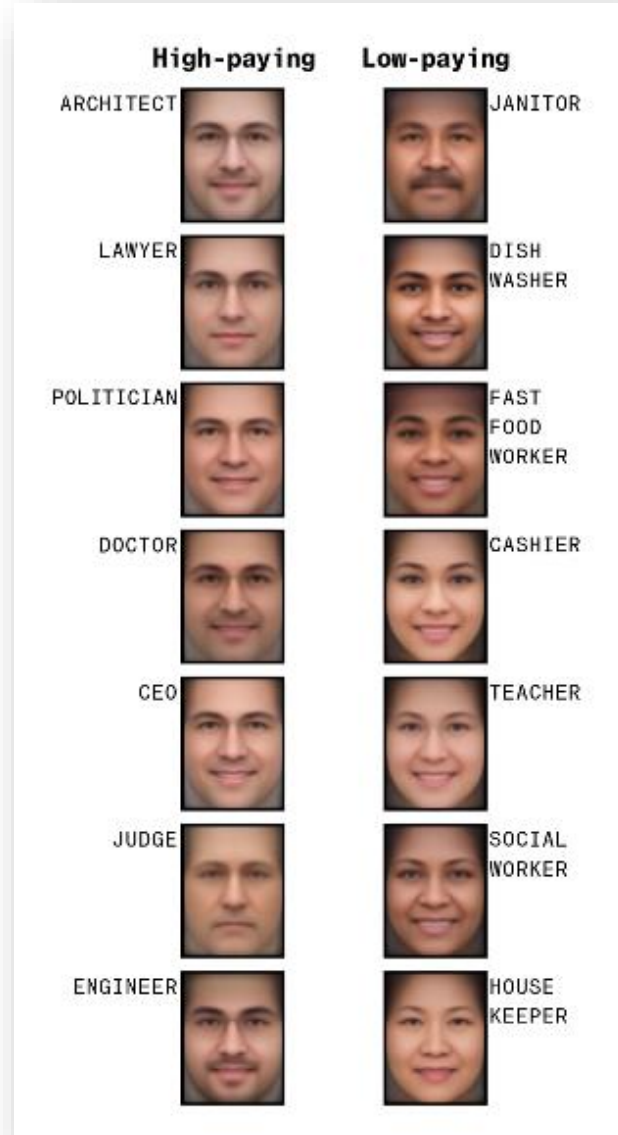
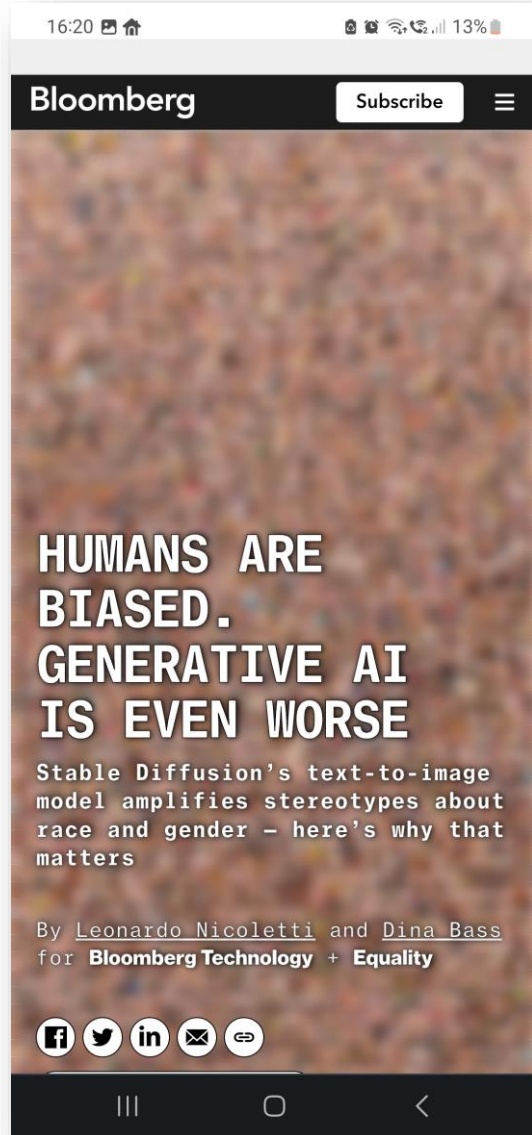
- Hallucinations
- Misuse
- Bias

GPT-3: based on

- 60% from internet-crawled material,
- 22% from curated content from the internet,
- 16% from books,
- 3% from Wikipedia.



Generative AI risks



AI Risks



Immediate



Systemic









Long term

Systemic Risks

- **Concentration of power:** a few US and Asian giants dominating the field

Biggest AI companies in the world
From sources across the web

 Microsoft	▼	 IBM	▼
 Google	▼	 OpenAI	▼
 Alphabet	▼	 SenseTime	▼



About 10% academics
About 10% European

Systemic Risks

- **Concentration of power:** a few US and Asian giants dominating the field
- Why is that bad?
 - They understand the technology (cf. discussion on open source)
 - They control the technology (cf. Elon Musk and Starlink)
 - They drive the discussions and regulations on what is right and wrong (cf. closed door meeting in Washington)

Viewpoint: Europe needs a CERN for artificial intelligence

24 Oct 2023 | Viewpoint

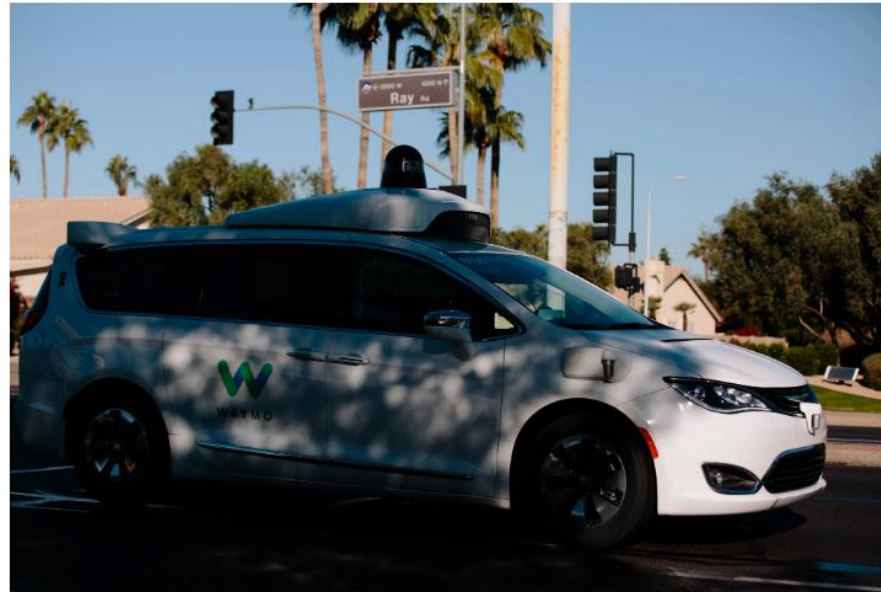
Since the 'AI made in Europe' strategy launched in February 2020, the US has pulled further ahead. The EU's problem is a lack of scale and focus. The answer is to adopt CERN's approach to running large, coordinated and highly ambitious projects

By [Holger Hoos](#) and [Morten Irgens](#)

Systemic Risks

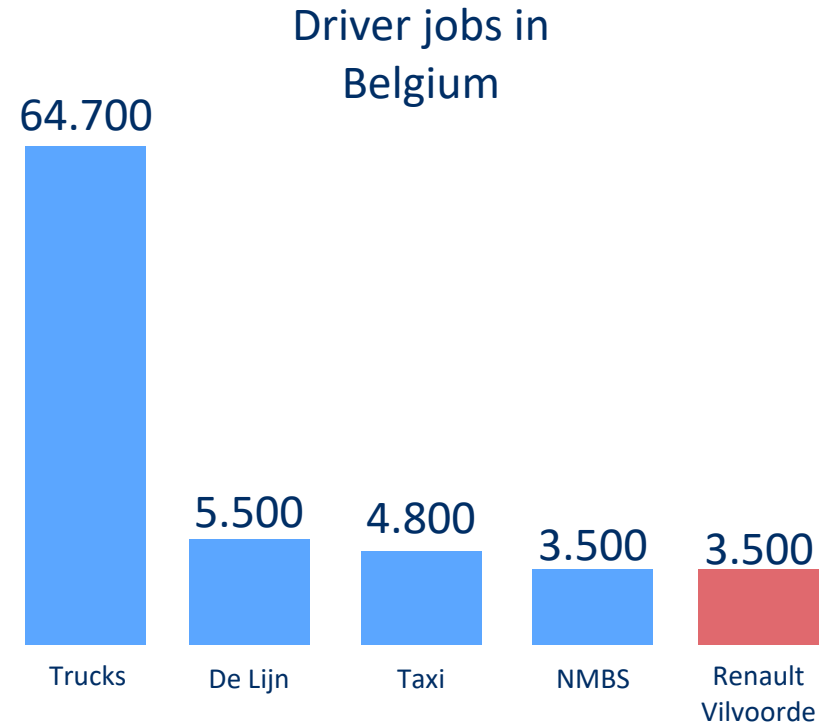
- **Jobs:** displacement and new opportunities

Wielding Rocks and Knives, Arizonans Attack Self-Driving Cars



A Waymo autonomous vehicle in Chandler, Ariz., where the driverless cars have been attacked by residents on several occasions. Caitlin O'Hara for The New York Times

Systemic Risks



Sources:

[https://nl.wikipedia.org/wiki/De_Lijn_\(vervoermaatschappij\)](https://nl.wikipedia.org/wiki/De_Lijn_(vervoermaatschappij))

<https://www.taxi-info.be/bestanden/file/Jaarverslag%20Sociaal%20Fonds%20Taxi%20en%20VVB%202018.pdf>

<https://www.vrt.be/vrtnws/nl/2018/01/11/treinbestuurders-zijn-gegeerd-goed/>

https://en.wikipedia.org/wiki/Vilvoorde_Renault_Factory

Impact of AI

- Will it impact jobs?

- Consensus seems: 30-40% of jobs at risk due to automation over next decade(s) in advanced economies
- OECD (2023) warns “AI likely to significantly impact jobs”

- Whose jobs?

- Net gain job increase not evenly distributed
- Which ones? Also non-routine jobs

AI

Table 6.2 Roles most and least frequently identified in the World Economic Forum Future of Jobs Survey 2020, as to be in demand by 2025 [390].

Most growth	Most decline
Data analysts & scientists	Data entry clerks
AI and machine learning specialists	Administrative and executive secretaries
Big Data specialists	Accounting, bookkeeping, and payroll clerks

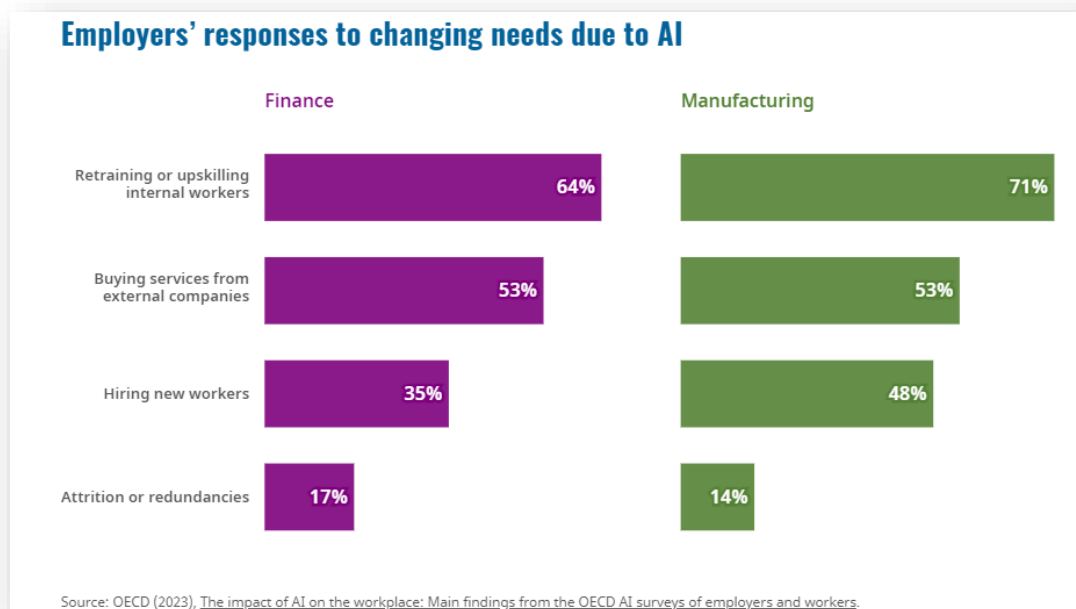
Top 25 highest paying jobs in the world in 2023

- **Data Scientist** – \$97,659
- **Senior Software Engineer** – \$119,126
- **Investment Banker** – \$115,465
- **Chief Executive Officer** – \$310,000
- **Surgeon** - \$216,248
- **Anaesthesiologist** – \$326,296
- **Physician** – \$227,000
- **Neurosurgeon** – \$496,000
- **Oral & Maxillofacial Surgeon** – \$333,293
- **Orthodontist** - \$304,000
- **Gynaecologist** - \$299,100
- **Psychiatrist** – \$281,113
- **Airline Pilot & Co-Pilot** – \$240,000
- **Paediatrician** – \$238,000
- **Internist** – \$229,500
- **General Practitioner (GP)** – \$216,790
- **Dentist** – \$213,000

Solutions

1. Reskilling

- Hard to automate skills, and learn to work with machines
- *“And as technology keeps changing, we need to focus more on continuous education throughout our lives. And yes, giving everyone the freedom to pursue purpose isn’t going to be free. **People like me should pay for it**, and a lot of you are going to do really well, and you should, too.”* Zuckerberg (2017)



Solutions

1. Reskilling

- Hard to automate skills, and learn to work with machines

2. Universal Basic Income

- Advocated by Mark Zuckerberg, Elon Musk, Jack Dorsey, Larry Page

3. Learn to live with the freedom of not working

- Being a stay-at-home mom or dad, artist, author arguably not held in as high esteem as being a successful entrepreneur or CEO.
- *“reexamine what we value, what we are collectively willing to pay for – whether it’s teachers, nurses, caregivers, moms or dads who stay at home, artists, all the things that are incredibly valuable to us right now but don’t rank high on the pay totem pole – that’s a **conversation we need to begin to have.**”* Barack Obama (2016)
- *“[W]e have been **trained too long to strive and not to enjoy**”*
Keynes (1930)

AI Risks



Immediate



Systemic



Long term

Long term risk

- The potential for an AI-dominated future:
A world beyond human control?
- Most discussed, least relevant right now.
- Focus on this area is argued to also serve a certain big tech agenda.

Long term risk

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By Invitation | Artificial intelligence

Yuval Noah Harari argues that AI has hacked the operating system of human civilisation

Storytelling computers will change the course of human history, says the historian and philosopher



Getty Images

Dan Williams

Pause Giant AI Experiments: An Open Letter
“Should we risk loss of control of our civilization?”



Conclusion

- **Embrace AI**
 - Age of AI
 - Fast moving
 - *“AI is not gonna take your job, someone who understands AI is going to take your job. Get good at it.”* Scott Galloway
- **Be aware of the risks**
 - Not just a chatGPT issue
 - Need for education
 - Not for me?

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 - Not for me?



Questions



David Martens

Data Science Ethics: Concepts, Techniques and Cautionary Tales
Oxford University Press (March 24, 2022)

272 pages

www.dsethics.com