

The importance of Auditing in the age of Generative Al

RO Masterclass 2023: Scarcity

23-11-2023



Introduction

ir. Marc van Meel



- Managing Consultant Responsible AI
- AI & Ethics Lead
- Recovering Data Scientist



Some concrete examples

X City of X Amsterdam

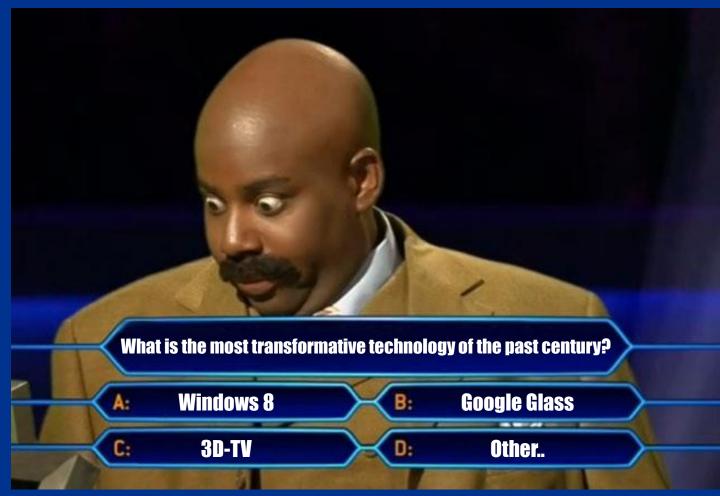
VERBOND VAN VERZEKERAARS



Prof. dr. S. (Sander) Klous – Partner KPMG University of Amsterdam



Q: What is the most transformative technology of the past century?



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It's.. the washing machine!





The telegraph vs the internet

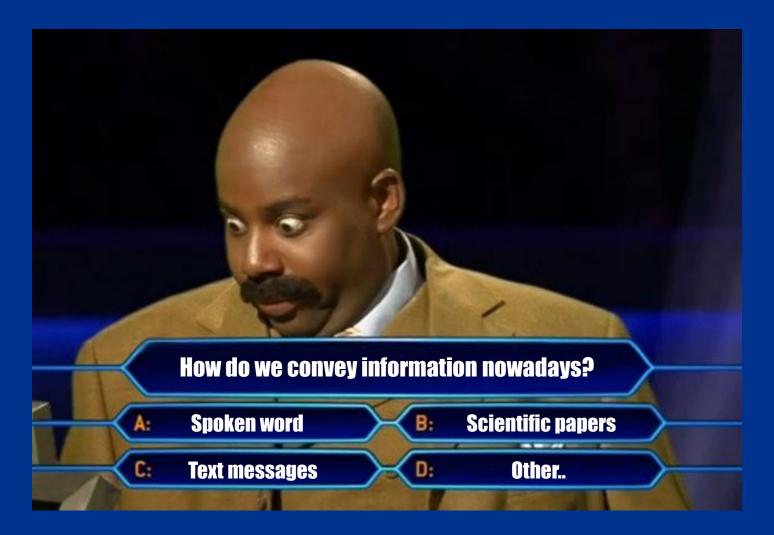


19th century

20th century



Q: How do we convey information nowadays?





It's.. by memes!

INTERNET CULTURE

'We actually elected a meme as president': How 4chan celebrated Trump's victory

Analysis by <u>Abby Ohlheiser</u> Freelance reporter November 9, 2016 at 2:00 p.m. EST

The Washington Post

Meme warfare: how the power of mass replication has poisoned the US election

Spread from the bottom up, political memes are now a form of propaganda - and it's killing our ability to intelligently orchestrate a political conversation





Information made for consumption

- We now live in a visual-audio society -> appearance is everything
- We consume short-form content -> distractions and declining attention span
- Lack of context can lead to polarization between consumers
- We mistake abstractions for the thing itself
- We lost sense of what it means to be well-informed
- Lack of knowledge vs overabundance of knowledge (ignorance)
- Entertainment has become the default form communication



Social media is shortening our attention spans

By using their phones less, Generation Z can accomplish more

September 2, 2022 | Dante Caloia



Even the "news" has become entertainment



Azarkan VERMORZELT Rutte in een prachtig betoog! Rutte is een racist!

33K views • 6 days ago

Corona

KPMG









The commercialization of useless information





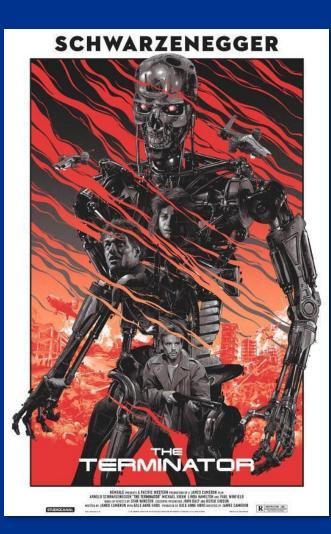






Death by robot is fun!









Let's talk AI - common characteristics of AI Systems Q: Where is AI being applied within your organization?



Making predictions based on large quantities of (historical) data



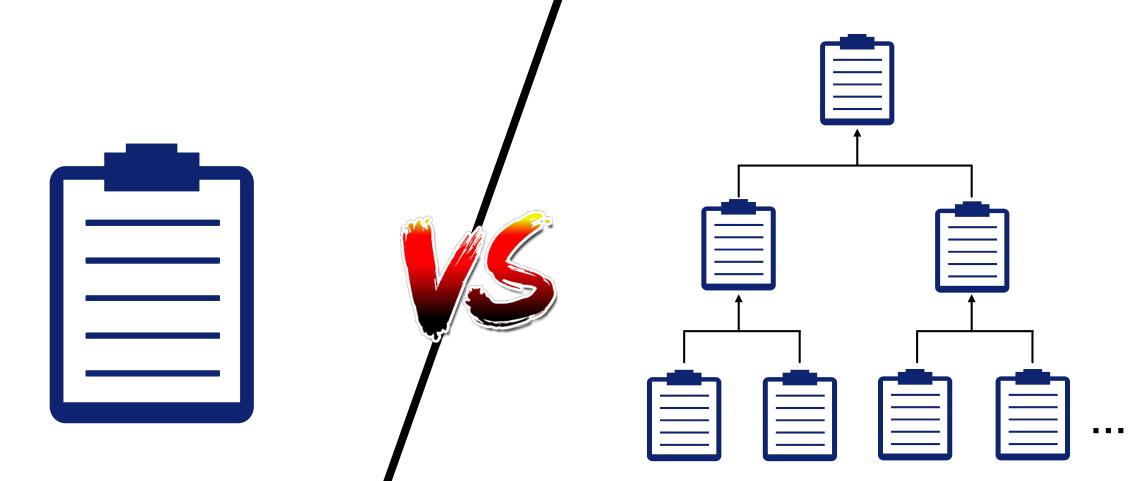
Contains a (self)learning aspect, with limited transparency between input and output relationships ("black box")



Often applied in combination with some degree of automated decision-making



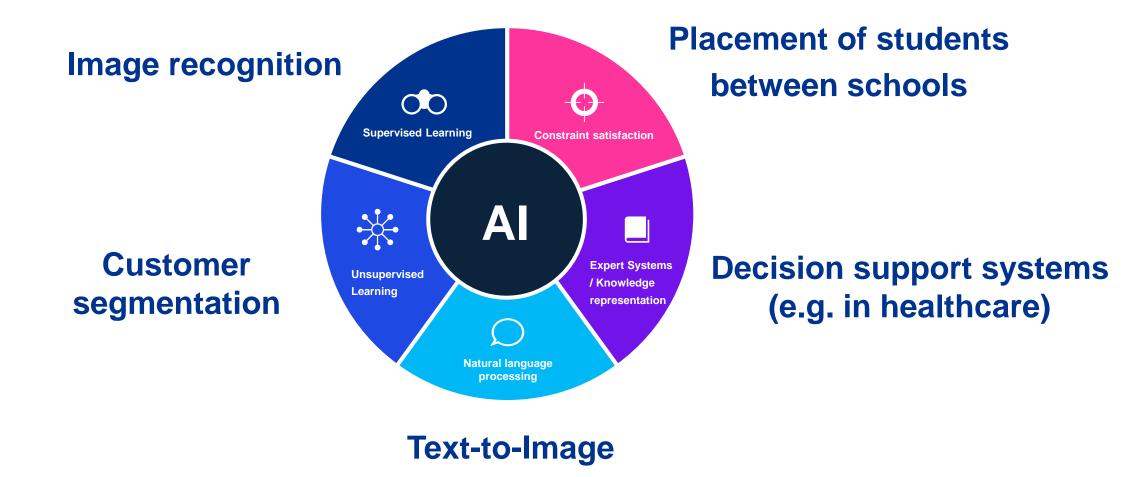
Traditional IT vs Al



IT (explicit)

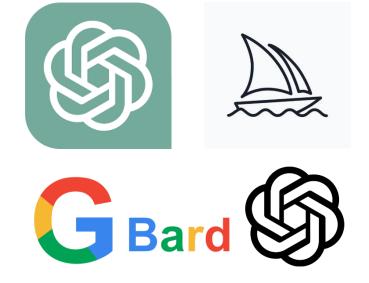


What AI is currently being used for





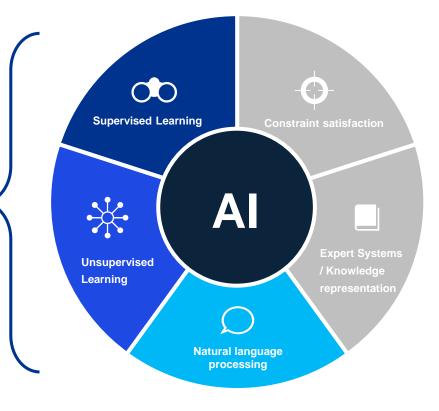
We now live in the age of Generative Al



Generative Al

- ChatGPT
- Dall-E
- Midjourney
- Stable Diffusion

•





Organizations are now faced with the novel challenges of Al

The development and deployment of AI poses unique challenges. Organizations should therefore take measures to ensure that AI is used in a responsible manner. The interests of citizens/customers, the organization and society intersect here.



Properly specifying your intended goal in alignment with your values is significantly more challenging than with 'traditional' IT.



The performance of AI is impacted when structural changes take place in the data or in the environment (drift).



The opaque nature (black box) of some AI systems can create both distrust as well as blind trust.



Defining who can be held responsible or accountable in automated decisionmaking is no trivial feat.



The use of AI can help to solve existing ethical issues, but it can also create new ethical challenges. **RELIABILITY** Al should do what it is intended to do

RESILIENCE Al should not only function now, but also in the future

EXPLAINABILITY

Al must provide results that can be comprehensible and verified

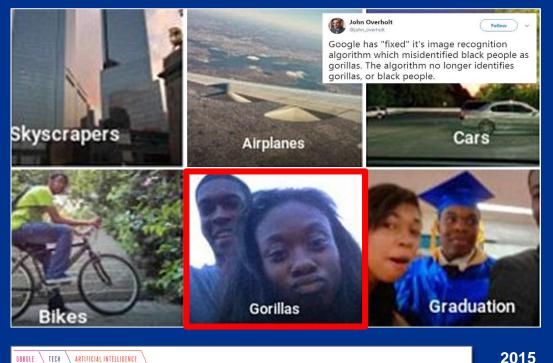
ACCOUNTABILITY

Al must have an owner which can be addressed

FAIRNESS AI must be fair, non-discriminatory and inclusive



Racist technology – a new problem?



GOOGLE \ TECH \ ARTIFICIAL INTELLIGENCE \

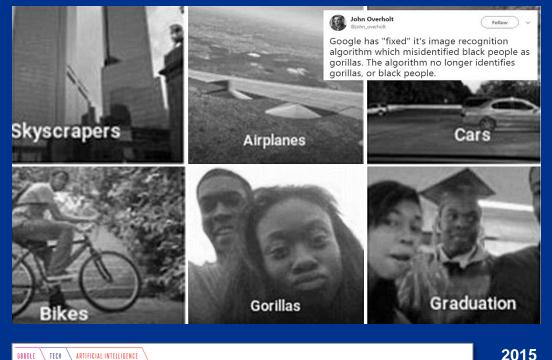
Google 'fixed' its racist algorithm by removing gorillas from its image-labeling tech

Nearly three years after the company was called out, it hasn't gone beyond a quick workaround

By James Vincent | Jan 12, 2018, 10:35am EST



Racist technology, exists longer than you think!



GOOGLE \ TECH \ ARTIFICIAL INTELLIGENCE `

Google 'fixed' its racist algorithm by removing gorillas from its image-labeling tech

Nearly three years after the company was called out, it hasn't gone beyond a quick workaround

By James Vincent | Jan 12, 2018, 10:35am EST



1940

The New York Times





Problems with chatbots are not new either!

TECH · ASHLEY MADISON

Ashley Madison Used Chatbots to Lure Cheaters, Then Threatened to Expose Them When They Complained

BY DAVID Z. MORRIS

July 10, 2016 at 7:11 PM GMT+2

MICROSOFT / WEB / TL;DR

Twitter taught Microsoft's AI chatbot to be a racist asshole in less than a day



By JAMES VINCENT Via THE GUARDIAN | Source TAYANDYOU (TWITTER Mar 24, 2016, 11:43 AM GMT-1 | _ 0 Comments / 0 New

ARTIFICIAL INTELLIGENCE

A college kid's fake, Al-generated blog fooled tens of thousands. This is how he made it.

"It was super easy actually," he says, "which was the scary part."

By Karen Hao

August 14, 2020

Man created a fake restaurant and it became the #1 restaurant in London



KPMG Responsible AI – our mission

We help make sure client AI Systems are fit for purpose, ethical and compliant with rules & regulations.

From high level principles.. RELIABILITY RESILIENCE **EXPLAINABILITY** ACCOUNTABILITY FAIRNESS

..to verifiable claims and testing procedures.

-How do we define reliability and which level is sufficient?

- -How deep/far should explainability go?
- —To whom should the explanation be understandable and how can you measure this?
- -What is the right criterion for fairness?

. . .

- -Which security standards apply to an AI System?
- —What are the (legal) requirements regarding accountability?

Explainability does not imply trust

- "Streetlight Effect"
- Explanations require domain expertise, which the reader often doesn't have
- Explanations risk exposing IP and company secrets
- Explanations enable actors with malicious intent to "game the system" and execute adversarial attacks





Trust requires **Reliability** – ask yourself, which plane would your rather step into?

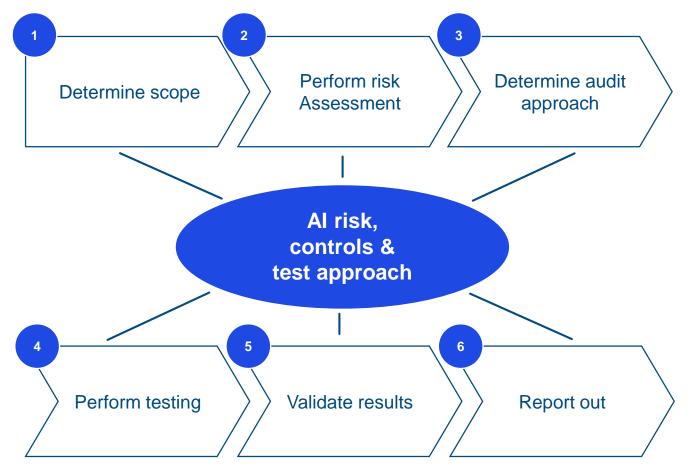




Auditing AI – a Risk-Based Approach

Our generic algorithm audit approach, similar to the way we audit other objects.

- 1. Determine scope. We first determine the type and scope the of Al system to be audited. Al systems never operate in isolation, we gain understanding of the business context and the business process it is a part of. If relevant we also consider it's role with respect to the financial statement audit (FSA).
- 2. Perform risk assessment. We use a risk-based approach to obtain an understanding of the technical details of the AI system and the business context in which it operates.
- 3. Determine audit approach. Based on the risk profile of the Al system and the relevant norms to which the Al system is to be evaluated we determine the proper combination of audit procedures and depth of testing. We draft a detailed control program by tailoring existing, potentially generic, norms and control frameworks to the specific characteristics and context of the Al system.
- 4. Perform testing. We perform testing based on our audit program.
- 5. Validate results. We discuss our initial findings with the stakeholders of the AI system from the client's side and address any remaining issues.
- 6. Report out. We report the final results.





We quantify the risks of Al along three different axis

Complexity

Ranging from traditional ruled-based systems to Neural Networks, is the application broadly characterizable as Artificial Intelligence?



Autonomy

To which degree is the decision-making process based on automated processing of data with no, or only pro forma, control by a human decision-maker?

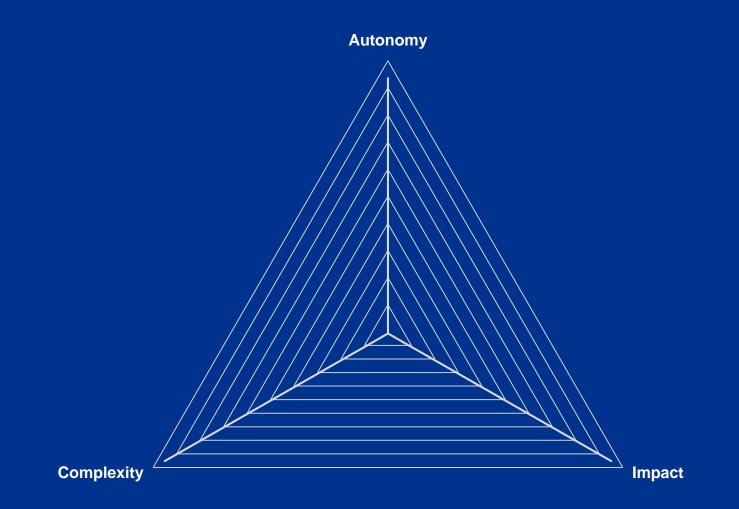


Impact

Does the interaction with the application affect rights, duties, powers, and/or liabilities of people, groups of people, or organizations?

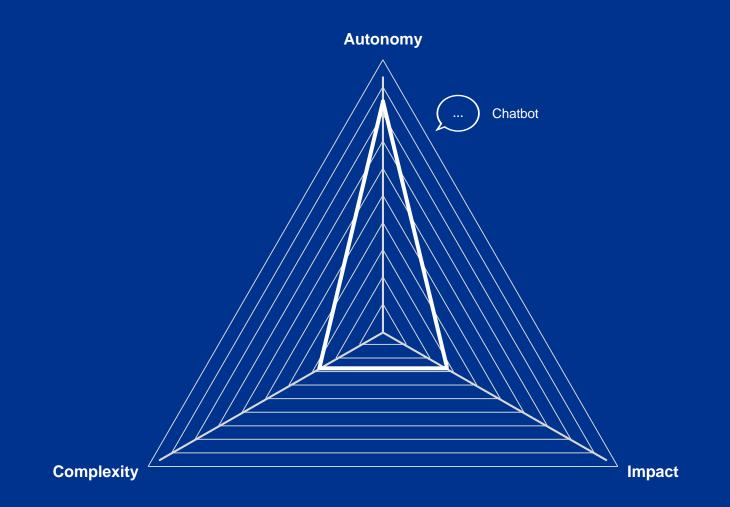


Al Systems have vastly different risk profiles



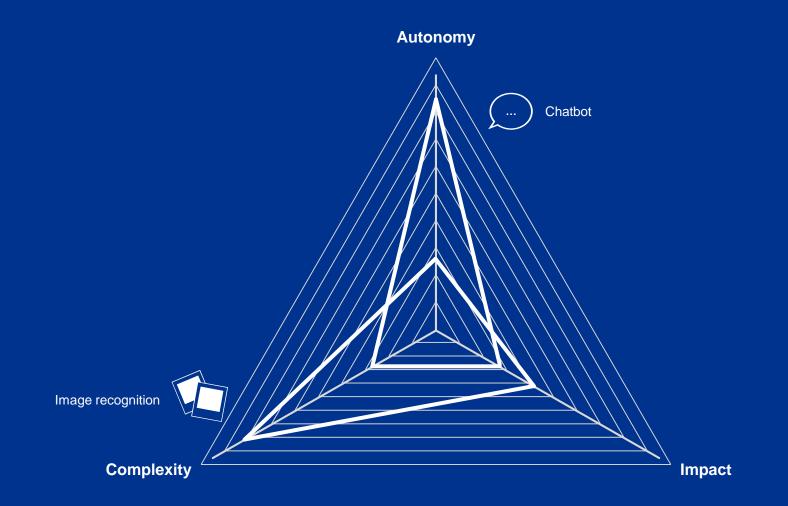


Al Systems have vastly different risk profiles



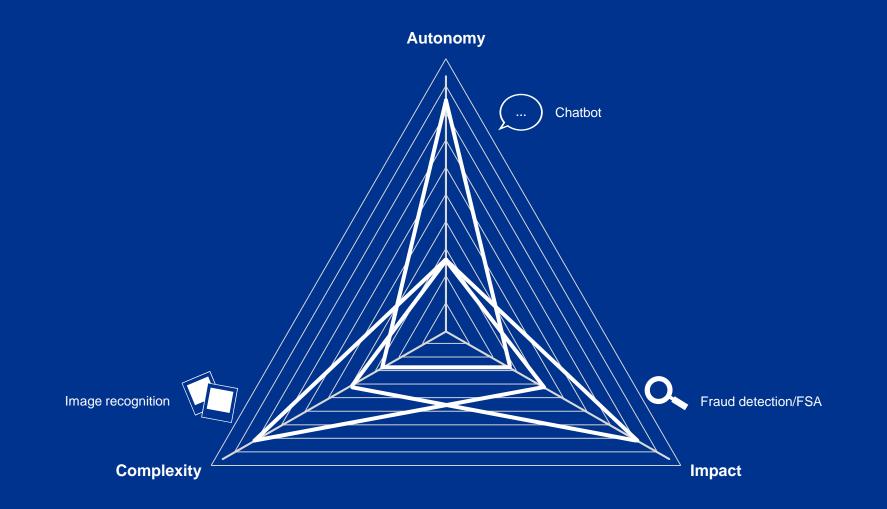


Al Systems have vastly different risk profiles



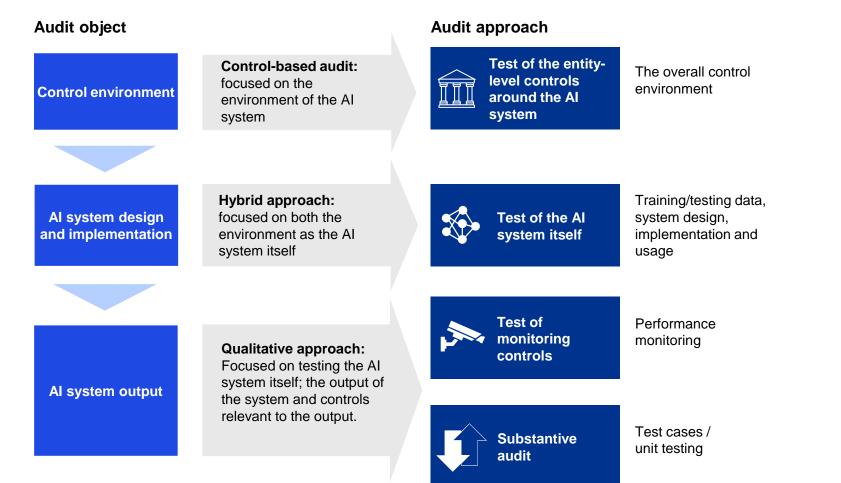


AI Systems have vastly different risk profiles





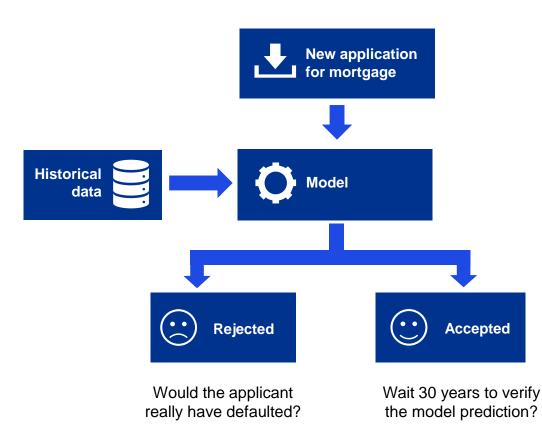
We combine audit procedures into a tailored approach based on relevant risks, norms and feasibility





Substantive procedures: the problem of only validating output

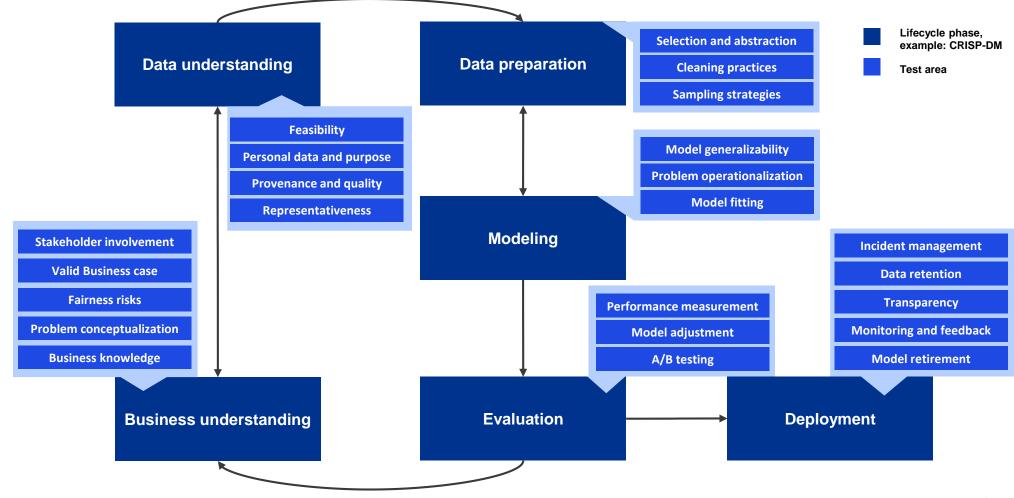
Example: how to properly assess whether your model has accurately predicted loan default probability?







Based on the chosen audit procedures, we test various aspects of the AI system along its cyclic life



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Want to know more? Must-read!

Progress in IS

Egon Berghout · Rob Fijneman · Lennard Hendriks · Mona de Boer · Bert-Jan Butijn *Editors*

Advanced Digital Auditing

Theory and Practice of Auditing Complex Information Systems and Technologies

OPEN ACCESS

Springer

https://link.springer.com/book/10.1007/978-3-031-11089-4

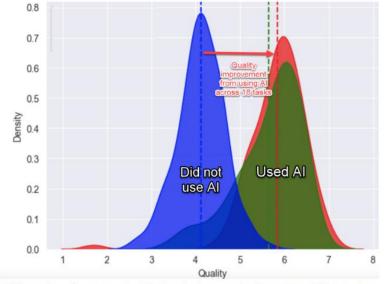


Every organization will become an Al organization, or go the way of the dinosaur

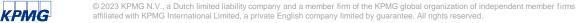
Enterprise workers gain 40 percent performance boost from GPT-4, Harvard study finds

VentureBea

Microsoft's Plan To Infuse AI And ChatGPT Into Everything Forbes



Difference in performance among BCG consultants, comparing those who used AI versus those who didn't. (Image Credit: Navigating the Jagged Technological Frontier)





Al significantly increases productivity

BIG IDEAS 2023: ARTIFICIAL INTELLIGENCE

Al Is Increasing The Productivity Of Knowledge Workers

Coding Assistants

Software engineers completed a coding task in less than half the time with AI coding assistant GitHub Copilot.

180 160 140 120 -55% Minutes 100 80 60 40 20 0 Hu man Human + Al

Time to Complete Coding Tasks: 2022*





\$150
5 Hours
\$0.08

22

Generative Image Models

According to our research, AI can create a graphic design for just \$0.08** in minutes - a di minimis cost compared to \$150 for human labor.



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Big Ideas 2023: Innovation is Taking Off

Time

Document Classification: KPMG Public 35

B

<1 Minute

Al significantly increases productivity

BIG IDEAS 2023: ARTIFICIAL INTELLIGENCE

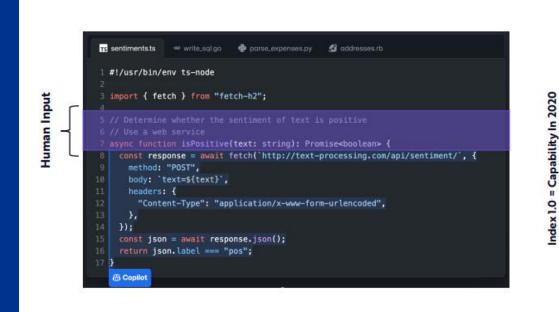
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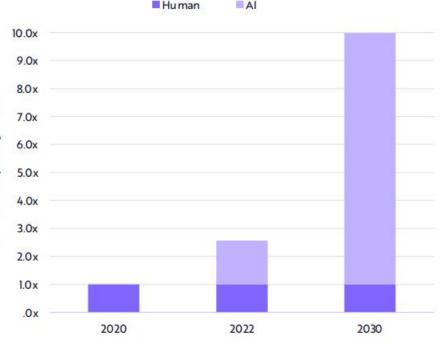
AI Could Lead To A 10-Fold Increase In Coding Productivity

Based on a 70% annualized drop in training costs and feedback loops, AI coding assistants like Copilot could increase the output of software engineers ~10-fold by 2030.

27



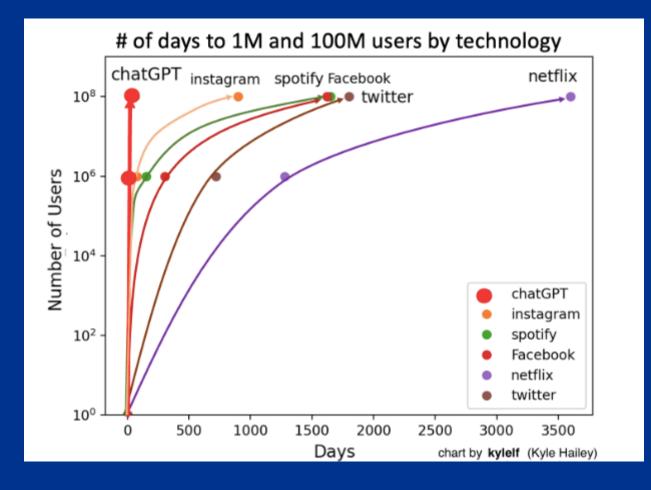
Github Copilot Example



Output of Human + Al: Coding Tasks

Big Ideas 2023: Innovation is Taking Off

The success of ChatGPT is it's accessibility



"Trust is good, control is better." - Lenin



Only 8% of CIO's has a vision about AI..



Zoeken

ρ

Home | Artikelen | Nieuws | Manageme

Gartner lanceert ai-wake-up call voor cio's

6 november 2023 14:13 | Luc Blyaert

Topic Management

f 🎔 in 🖂



Gartner vindt dat cio's de komende twaalf tot 24 maanden werk moeten maken van een duidelijke strategie voor artificiële intelligentie. 'Generatieve ai is geen nieuwe technologie en ook geen businesstrend. Het is een fundamentele shift in hoe mensen en machines met elkaar omgaan', vertelde vice president analist Mary Mesaglio tijdens de openingstoespraak van het Gartner Symposium in Barcelona. Daar zijn bijna 6.500 cio's en itleiders aanwezig.

Zij was verrast dat iets meer dan de helft van de ondervraagde ceo's aangaf dat ze de cio zien als de leidende figuur bij de ontwikkeling van artificiële intelligen-

tie. 'Dit is een ongelooflijke kans voor de cio om het verschil te kunnen maken.' Ze vreest wel dat allerlei afdelingen zoals marketing, sales of de ceo die rol zal willen opnemen. In juni ondervroeg Gartner ruim 600 cio's en amper 8 procent liet weten dat de organisatie een visie had op het gebruik van ai. Een op de drie had helemaal geen plannen in die zin.

Gartner maakt een duidelijk verschil tussen 'everyday ai' en 'game changing ai'. In het eerste geval gaat het om efficiëntie en productie. Daar zou ai voor verbetering van 5 tot 20 procent kunnen zorgen, 'wat toch nog vrij beperkt is', aldus Mary Mesaglio. In het tweede geval gaat het vooral om creativiteit en zal het voor een omwenteling van businessmodellen en zelfs hele industrieën zorgen. Dat ai geen goedkope oplossing zal worden is nu al duidelijk, hoewel Gartner hier geen bedragen wil of kan vrijgeven. Het schuift cio's een lijstje met vier to-do's voor: wees klaar voor ai, zorg voor ai-ready princiepen, maak je data ai-klaar en vooral, zorg ervoor dat je security ai-ready is.

https://www.computable.be/artikel/nieuws/management/7572603/5440850/ gartner-lanceert-ai-wake-up-call-voor-cios.html



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KPMG RAAD - Programma De Glazen Leider

KPMG vorig jaar een programma gestart onder de noemer 'De glazen leider'. KPMG heeft dit initiatief genomen omdat wij een groeiende angst constateerden onder leiders om beslissingen te nemen waar risico's aan verbonden zijn (hypegiaphobia). Deze trend wordt onder andere gedreven door moderne technologieën, waardoor beeldvorming een steeds prominentere, zo niet belangrijkere plek inneemt naast de inhoud.

Dit bestond uit o.a.

- □ 9 interviews
- **6** rondetafelgesprekken met 30 (ervarings)deskundigen
- □ 1 whitepaper *De Glazen Leider*
- **2** conferenties met 80 bestuurders
- **5** opinieartikelen

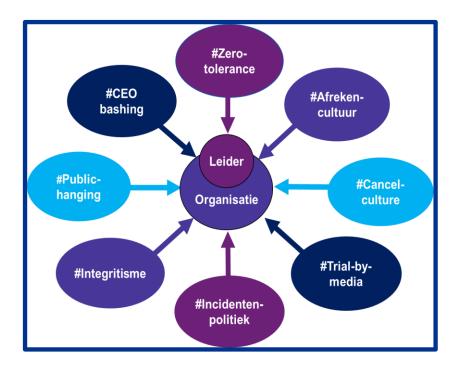
KPMG RAAD

KPMG RAAD inspireert en helpt commissarissen, bestuurders en NextGen bij het nog beter invullen van hun rol. Het bestaat uit een magazine en een online platform waar de nieuwste relevante inzichten en ervaringsverhalen van collega's elkaar afwisselen. Daarnaast organiseert KPMG met het RAAD-programma diverse evenementen waar urgente thema's voor in de boardroom worden uitgelicht.





De schadelijke gevolgen



- Hypegiaphobia
- Afhaken talentvolle leiders
- Overregulering
- Doorgeschoten compliance kosten
- Rem op innovatie
- Verminderde klantenservice
- Afstoten producten, diensten, markten



Can we Trust ChatGPT?

Large Language Models (LLM) – autocomplete on steroids

Goal: produce a reasonable continuation of the text we have so far Idea: simply calculate the probability of the next word in a text and repeat 😯

I am walking my ____



Large Language Models (LLM) – autocomplete on steroids

Goal: produce a reasonable continuation of the text we have so far Idea: simply calculate the probability of the next word in a text and repeat





.. but that would have been too easy!

- Problem 1: there doesn't exist enough text in the world to deduce all probabilities..
- Problem 2: we can't even compute the probabilities of all text that's currently out there..

Quick maths:

The English language contains around 40.000 common words. Number of possible 2-grams is 1.6 billion Number of possible 3-grams is 60 trillion

Essay of 20 words > #particles in the universe.

Solution: use a model to predict these probabilities, even if we never saw the sequences of words themselves.

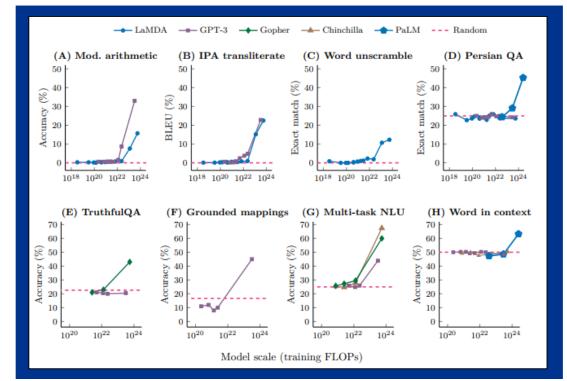


A glimpse of intelligence - emerging properties of ChatGPT

Emerging properties: functionality present in larger models and not in smaller models, which improves with an increase in model size, and which cannot be predicted from smaller models.

- Excellent at text summarization, classification and sentiment analysis
- Generates "human sounding" text
- Can produce programming code
- Displays reasoning capabilities
- Can produce multi-lingual text
- One/few-shot learning
- Can assume a 'role'
- ...
- Rise of prompting: programming LLM's

Language is deeper than we think, it captures the essence of reasoning (to some degree)



[2206.07682] Emergent Abilities of Large Language Models



Your hallucinating buddy



- ChatGPT is trying to make sense of it's inputs, similar to dreaming
- As a result, ChatGPT is able to confidently bullsh*t about things that are wrong and/or don't exist!
- ChatGPT lacks any actual knowledge of what is represented in text (objects/concepts)
- Not every aspect of reality can be captured in human language itself! (context needed)
- Some text requires more context than others (Mandarin vs English)

People are starting to realize ChatGPT has the confidence and verbal ability of a 40-year old, but the world representation of a 4-year old.

[2302.03494] A Categorical Archive of ChatGPT Failures



"Asking whether a computer can think is as interesting as asking if a submarine can swim."

- Edsger W. Dijkstra



Responsible Alis no Longer a Luxury, but a Precondition for Success in the Digital Era

Generative Al unlocks opportunities, while bringing forth new challenges

Brings Challenges

?	How to audit AI?

Reputational damage





Rem op innovatie

Doorgeschoten (non)

compliance kosten





Unlocks Opportunities



Increased efficiency

C

Increased quality

Increased fairness



Enhanced risk assessment & **Predictive analyses**



Continuous monitoring & auditing



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Blijf in control en laat uw organisatie niet op deze manier in het nieuws komen



Vrijdag 23 juni 2023, 15:32

DUO mag algoritme niet gebruiken totdat meer bekend is over mogelijke discriminatie

Berichtgeving Follow The Money zorgt ervoor dat politie stopt met algoritme

NOS Nieuws • Zaterdag 15 juli, 14:00 • Aangepast zaterdag 15 juli, 14:05

UWV verzamelde illegaal gegevens van uitkeringsgerechtigden NOS Nieuws • Maandag 17 juli, 17:57

Privacywaakhond: organisaties hebben algoritmes niet goed onder controle



Vragen om uzelf en de organisatie te stellen

- 1. Heeft de organisatie voldoende overzicht waar Al wordt ingezet binnen de organisatie? Is deze Al besluit ondersteunend of autonoom?
- 2. Welke (ethische) risico's en bijbehorende beheersingsuitdagingen zijn er met de inzet van Al binnen de organisatie?
- 3. Welk overkoepelend beleid heeft de organisatie geformuleerd ten aanzien van de (beheerste) inzet van Al, en hoe verhoudt zich dat met de business strategie?
- 4. Hoe heeft de organisatie de risico's van Al geborgd en opgenomen in risk management? (gedragscode, internal audit, governance, risk-assessment, training, awareness, rollen en verantwoordelijkheden, etc.)
- 5. Is er een protocol inzake gebruik van ChatGPT en andere openbaar toegankelijke technologieën voor onze medewerkers (- wenselijk/noodzakelijk)?
- 6. Welke ethiek heeft de organisatie geformuleerd ten aanzien van de ontwikkeling en inzet van AI? (leidende principes, normen, ethische commissie, etc.)
- 7. Waar is dit onderwerp organisatorisch belegd? Welk orgaan/functie gaat zich Al toerekenen?
- 8. Worden de costs of control van Al meegewogen in innovatietrajecten?
- 9. Is er duidelijk begrip van de ROI van AI en innovatie?
- 10. Hoe blijf ikzelf geïnformeerd? -> themadagen, advies, of stuur mij (Marc) een berichtje! :)



Thank you, let's grab a coffee!



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