

# DEEP NETWORK DEVELOPMENT

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## Lecture 1.



# Modern Al

Budapest, 14<sup>th</sup> February 2025



**2** Deep Learning Overview

**3** Modern AI & State of AI

**Deep Network Development** 

## Lecture 1.



# **Course Details**

Budapest, 14<sup>th</sup> February 2025



**2** Deep Learning Overview

**3** Modern AI & State of AI

#### Staff

**Lecture and Practice:** 



Imre Molnár <u>imremolnar@inf.elte.hu (wkzina@inf.elte.hu)</u> <u>https://curiouspercibal.github.io/</u> Tamás Takács <u>tamastheactual@inf.elte.hu</u> (cjrnie@inf.elte.hu) <u>https://tamastheactual.github.io/</u>



1. Course Details

**Demonstrators**:



Máté Badó (blkvOu@inf.elte.hu)

Instructors:



Ádám Fodor (<u>foauaai@inf.elte.hu</u>)





#### Samiha Nasser (wp01th@inf.elte.hu)



Zoltán Barta (<u>dguqkf@inf.elte.hu</u>)

#### 1. Course Details

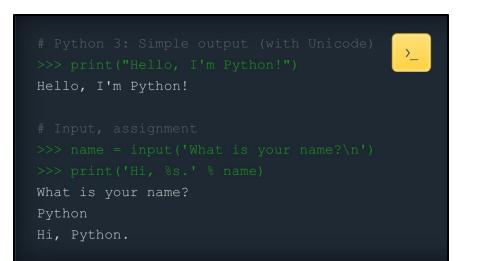
#### Structure

- Classes are every Friday in the South Building:
  - Lectures: 8:00 10:00 (0-823 Kitaibel Pál terem)
  - Practices: 10:00 12:00 (0-822 Mogyoródi József terem)
- Lecture recordings will be available throughout the semester
- Course syllabus is available on Canvas
- All the materials (lecture slides, practice notebooks, ...) will be uploaded to Canvas

## **Prerequisites**

#### Have a basic understanding of:

- Linear Algebra
- Probability Theory
- Programming Skills (for practices)

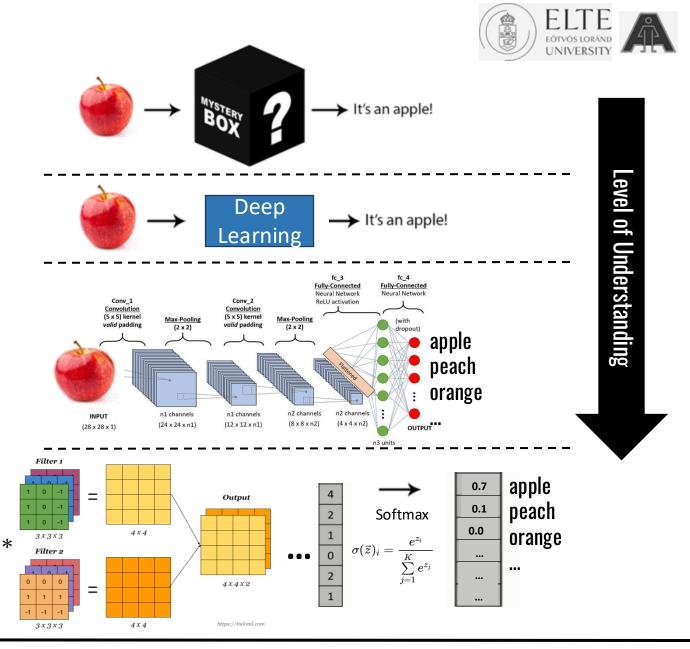


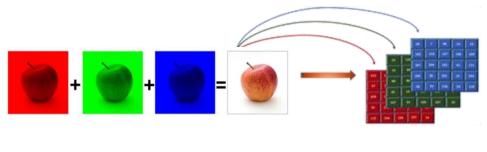


Matrix rules		
scalar multiplication	$n\begin{bmatrix}a & b & c\\ d & e & f\end{bmatrix} =$	[na nb nc] [nd ne nf]
matrix addition e f	$\begin{cases} f \\ f $	$\begin{bmatrix} a+g & b+h \\ c+i & d+j \\ e+k & f+l \end{bmatrix}$
matrix multiplication $\begin{bmatrix} a \\ d \end{bmatrix}$	$ \begin{array}{c} b & c \\ e & f \end{array} \begin{bmatrix} g & h \\ i & j \\ k & l \end{bmatrix} = $	$\begin{bmatrix} ag + bi + ck & ah + bj + cl \\ dg + ei + fk & dh + ej + fl \end{bmatrix}$
Probability Line		
	, <sup>(</sup> S),	
Impossible 0 1-in-6 chanc	Even Chance e $\frac{1}{2}$	A-in-6 chance
(0%) <u>1</u> 6 (16%	(50%)	(100%) <u>4</u> (66%)

## Description

 This course provides students with a comprehensive understanding of how Deep Neural Networks work:





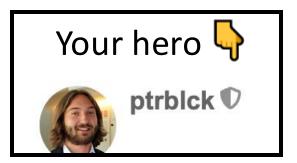
## Description



 The practical part of this course equips students with the necessary skills to implement various Deep Neural Network architectures using a framework called PyTorch based on Python programming language;









### **Evaluation**

- 2 Homeworks (announced on week 3 and 5)
- 4 Quizzes (made available on week 3, 6, 8, and 10)
- **1 Assignment** shared during the **7th week** (tentative) and have submission deadlines (no extension)
  - The assignment **must be defended** (instructors and demonstrators ask questions to verify their knowledge)

Assignment 1 [Topic TBD]

**TENTATIVE DATES:** 

- Deadline: end of week 11 (02.05.2025 11:59 PM)
- Defense: practice of week 12 (09.05.2025)

### **Evaluation**



• Lecture Grade:

#### Lecture = $0.1 \times (Q1 + Q2 + Q3 + Q4) + 0.6 \times T1$

- **Q1, Q2, Q3, Q4** Quiz grades
- **T1** Theoretical defense grade
- Practice Grade:

Practice =  $0.2 \times (H1 + H2) + 0.6 \times A1$ 

- **H1, H2** grade from homework 1 and 2
- A1 grade from assignment 1 submission and code grade
- To be eligible for the final exam, you must achieve at least **a grade of 2** in both the **Lecture** and **Practice** component
- Further information about the exam will be released later

**Deep Network Development** 

## Lecture 1.



# **Deep Learning Overview**

Budapest, 14<sup>th</sup> February 2025



**2** Deep Learning Overview

**3** Modern AI & State of AI

## **Artificial Intelligence (AI)**





## "Intelligent" Machines / **Systems** ... behave like humans ... talk like humans

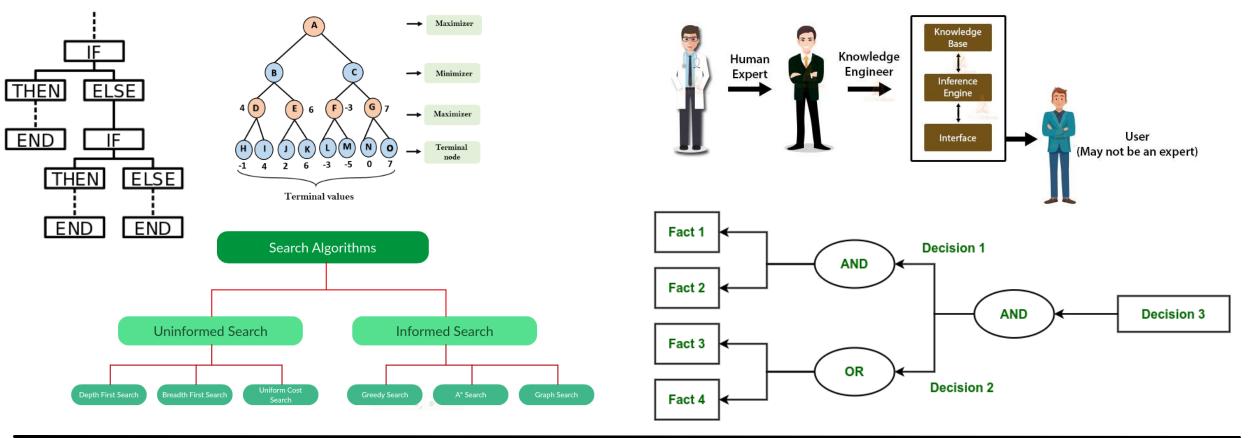






### **Artificial Intelligence (AI)**

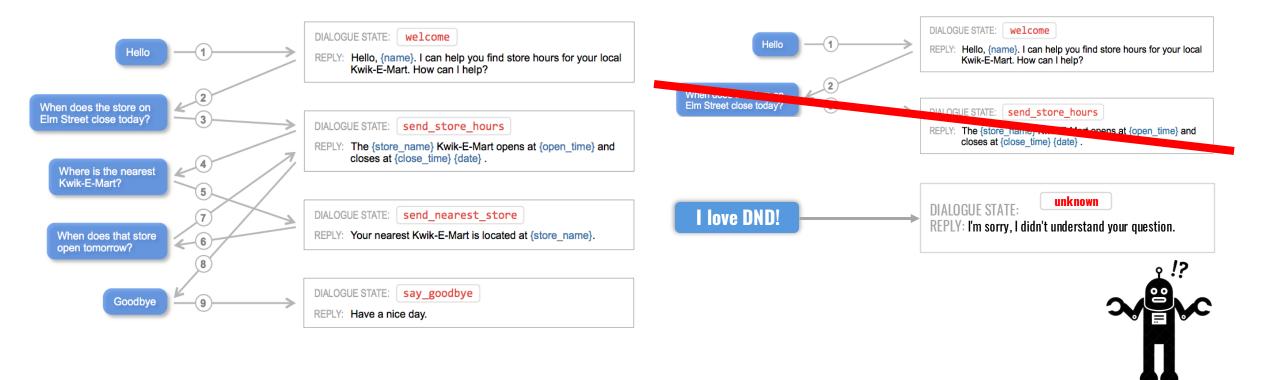
- Traditional AI methods used to be rule-based or goal oriented.
- Expert Systems: contain a knowledge base and rules for reasoning and decision-making





## **Artificial Intelligence (AI)**

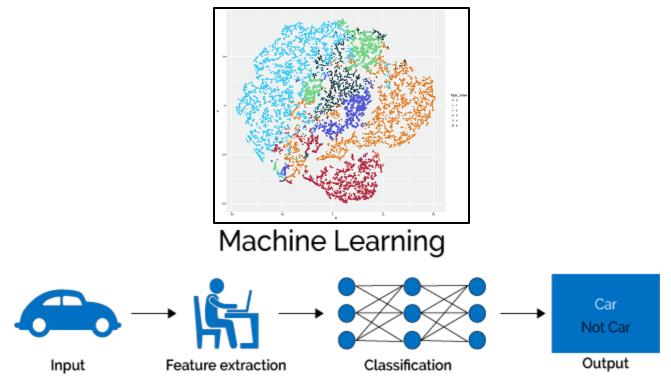
- Traditional AI methods used to be rule-based or goal oriented.
- Expert Systems: contain a knowledge base and rules for reasoning and decision-making



## **Machine Learning (ML)**

**ML:** a subfield of AI that focuses on the development of algorithms and models capable of learning from data and making predictions without being explicitly programmed.



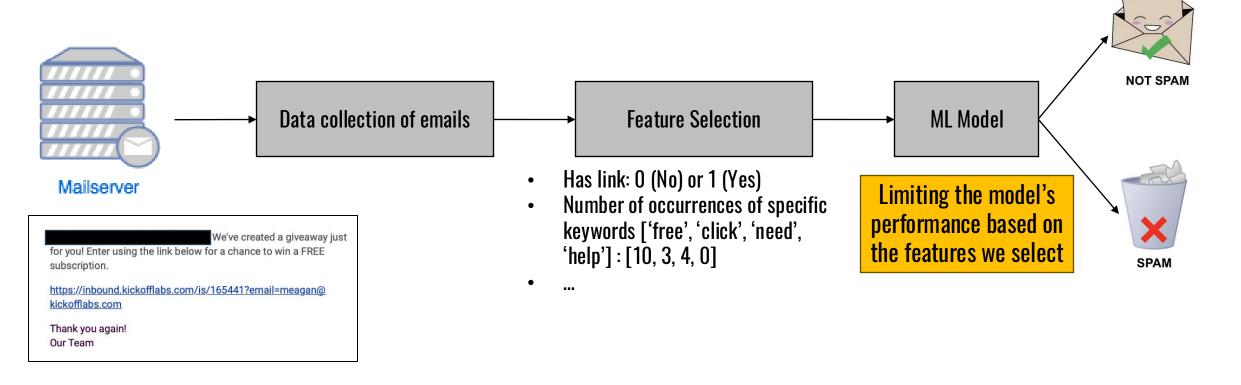






## **Machine Learning (ML)**

**ML:** a subfield of AI that focuses on the development of algorithms and models capable of learning from data and making predictions without being explicitly programmed.





## **Deep Learning (DL)**

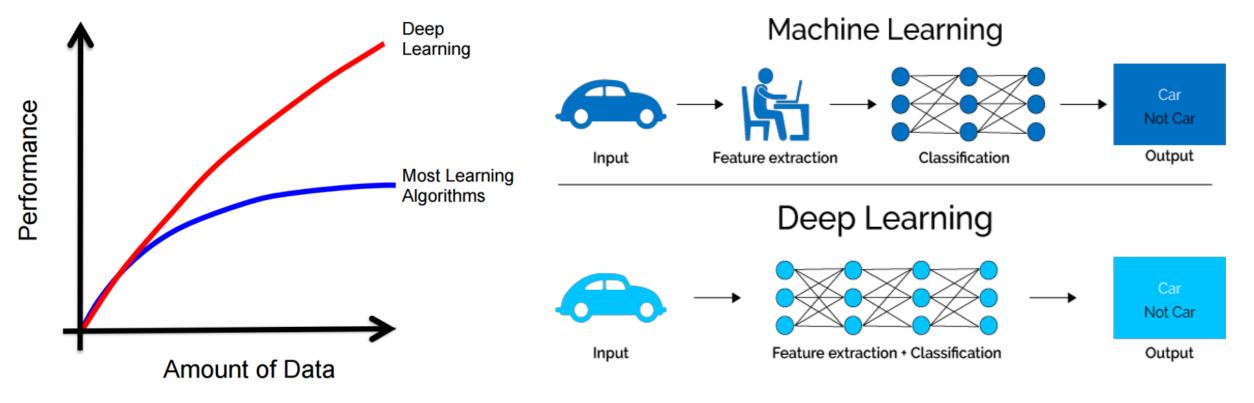


**DL:** a subfield of ML that focuses on the development and training of deep neural networks. Deep Learning algorithms leverage these deep architectures to automatically learn hierarchical representations of data, enabling them to capture complex patterns and relationships.



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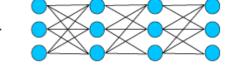


#### 2. Deep Learning Overview

## **Deep Learning (DL)**







Feature extraction + Classification







ELTE EÔTVÔS LORÂND UNIVERSITY

Feature extraction + Classification



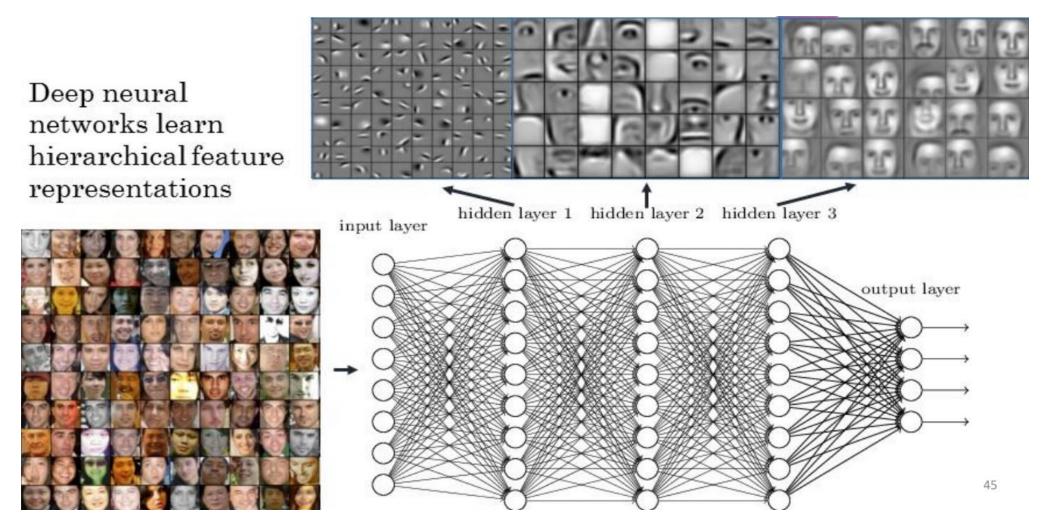
Dog

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#### 2. Deep Learning Overview

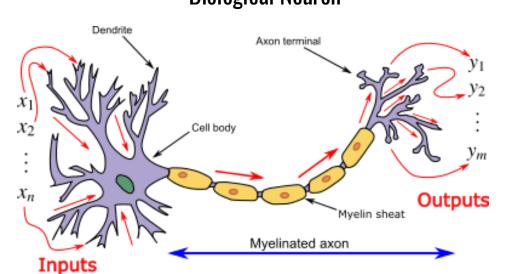


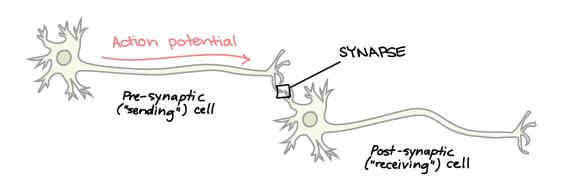
## **Deep Learning (DL)**



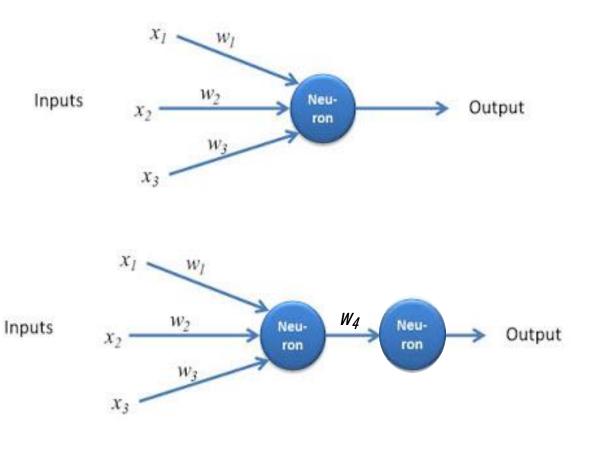


#### **Artificial Neural Networks are inspired in Biological Neural Networks Biological Neuron**









#### 2. Deep Learning Overview



#### ... but the mechanism is different

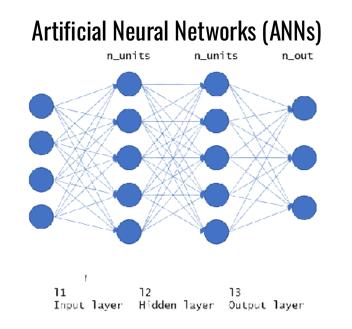




#### **Biological vs Artificial Neuron**

**Biological Neural Networks (BNNs)** 





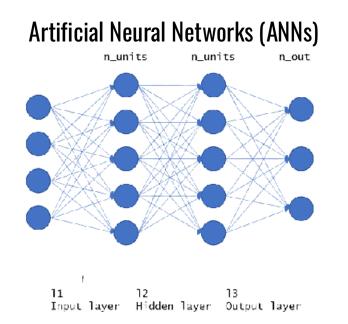
• ANNs have pre-defined and fixed architectures that can only change the strength of connections between neurons (weights). BNNs can do the former, but also create new and reorganize existing connections between neurons (neuroplasticity) and even create new neurons (neurogenesis).



### **Biological vs Artificial Neuron**

**Biological Neural Networks (BNNs)** 





- ANNs use continuous values with continuous activation functions to propagate information throughout the network, whereas BNNs function as firing systems that can be activated or not (allowing or blocking information to pass).<sup>1</sup>
- In BNNs, neurons that fire together, wire together. The same does not hold for ANNs.<sup>2</sup>

<sup>1.</sup> There are computational models and algorithms inspired by the discrete firing behavior of biological neurons, such as spiking neural networks.

<sup>2.</sup> Hebbian learning

#### 2. Deep Learning Overview

**Overview** 

#### Artificial Intelligence

Any technique that enables computers to imitate human behavior.

#### **Machine Learning**

Computers capable of learning from data without explicitly being programmed.

#### **Deep Learning**

Computers that learn from large amounts of data using Deep Neural Networks **Deep Network Development** 

## Lecture 1.



**3** Modern AI & State of AI

# Modern Al & State of Al

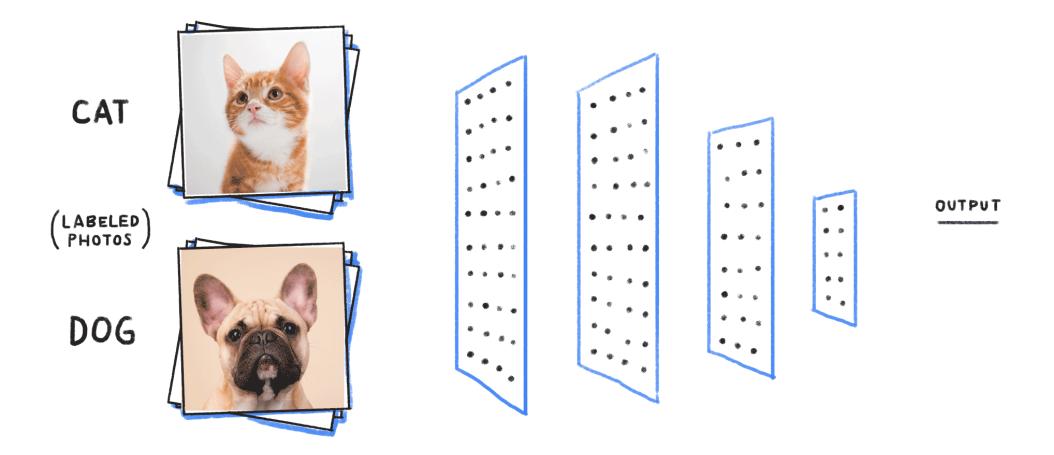
Budapest, 14<sup>th</sup> February 2025



**2** Deep Learning Overview

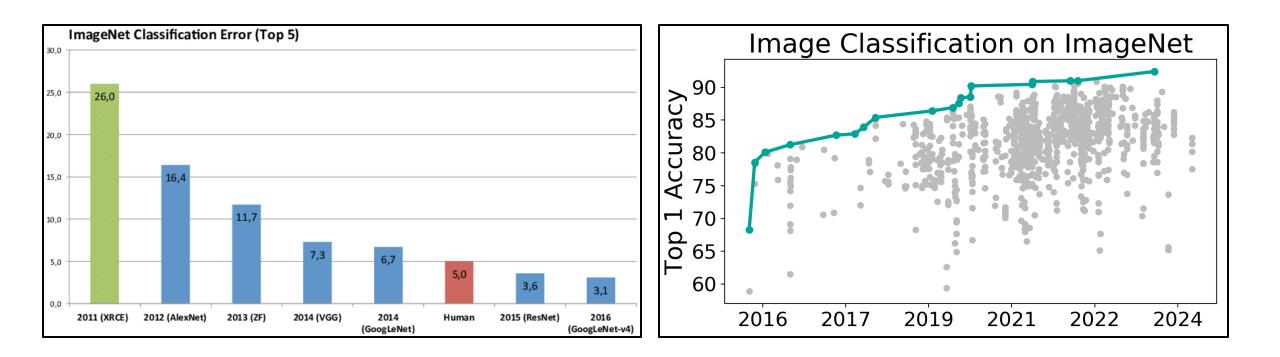


#### **Classification**



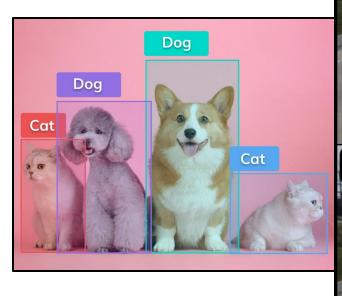


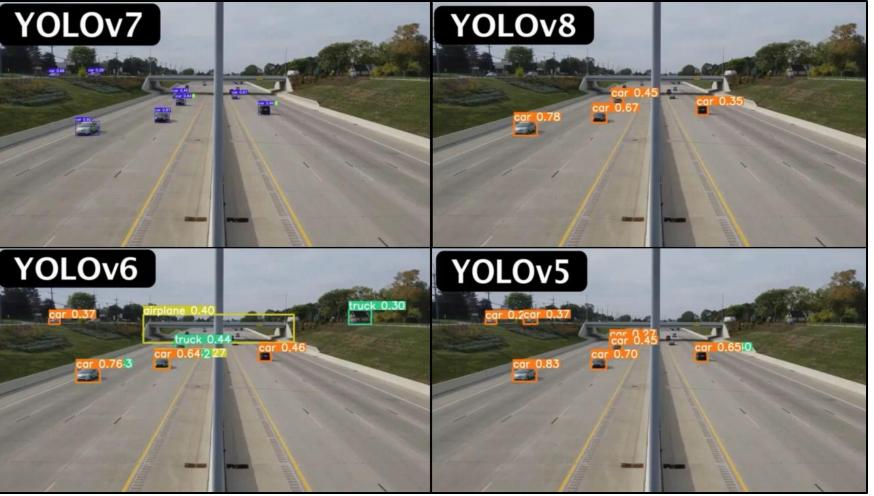
#### **Classification**





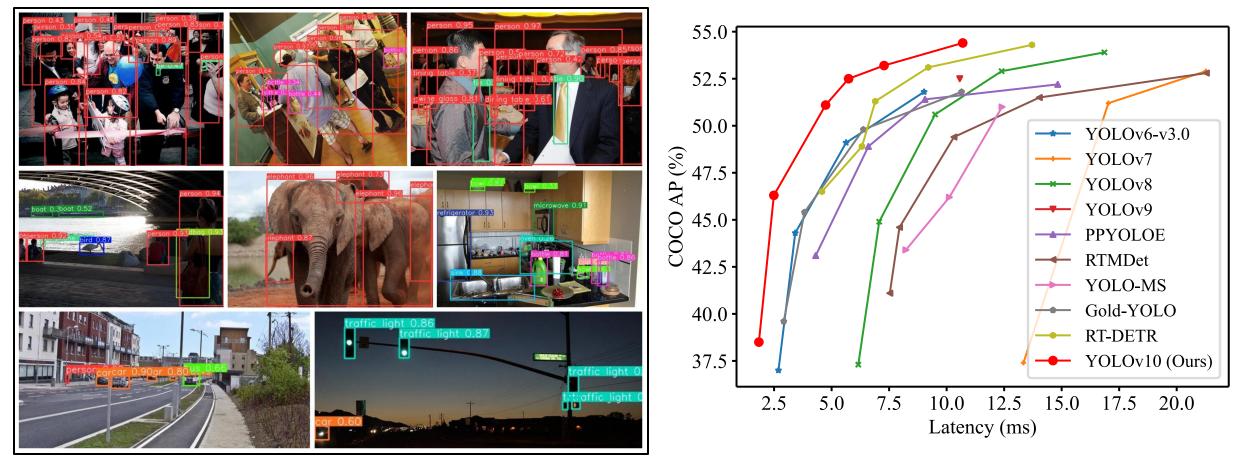
#### **Object Detection**







#### **Object Detection [1]**



[1] Wang, A., Chen, H., Liu, L., Chen, K., Lin, Z., Han, J., & Ding, G. (2024). YOLOv10: Real-Time End-to-End Object Detection. arXiv [Cs.CV]. Retrieved from http://arxiv.org/abs/2405.14458



**Image Segmentation** 

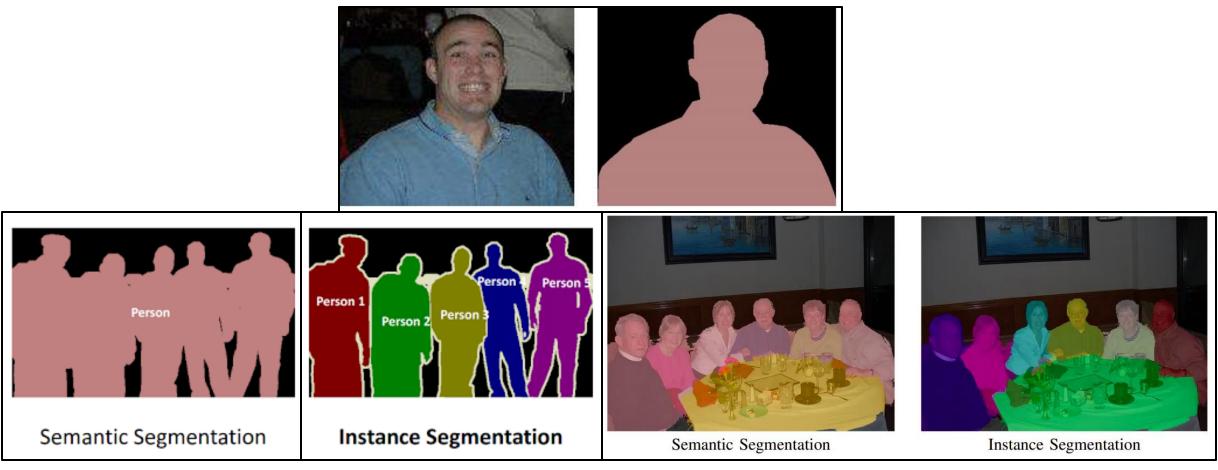
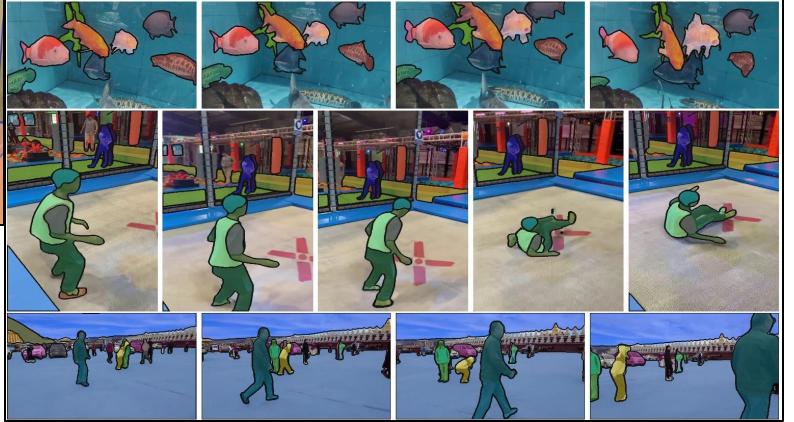




Image Segmentation: Segment Anything 1 & 2 (SAM) [2]



- SAM segments any type of object (even if it was not explicitly trained on that object)
- SAM 2 is built on top of SAM with the addition of memory for tracking objects overtime.



[2] Ravi, N., Gabeur, V., Hu, Y.-T., Hu, R., Ryali, C., Ma, T., ... Feichtenhofer, C. (2024). SAM 2: Segment Anything in Images and Videos. arXiv [Cs.CV]. Retrieved from http://arxiv.org/abs/2408.00714



#### Text-to-Image



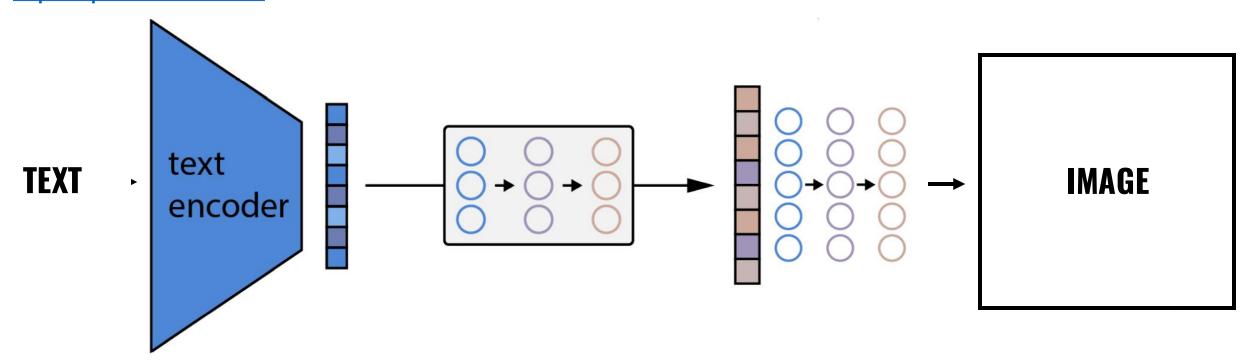
#### Stable Diffusion 1.2 (2022)

#### FLUX.1-schnell (2024)

FLUX.1-dev-LoRa (2024)

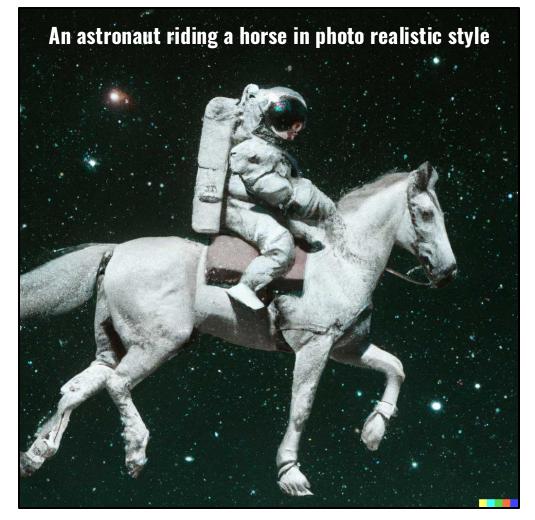


#### **Text-to-Image: DALL-E 2** <u>https://openai.com/dall-e-2/</u>



[3] Ramesh, A., Dhariwal, P., Nichol, A., Chu, C., & Chen, M. (2022). Hierarchical Text-Conditional Image Generation with CLIP Latents. arXiv [Cs.CV]. Retrieved from http://arxiv.org/abs/2204.06125







# **Advancements in AI (Deep Learning methods)**





# **Advancements in AI (Deep Learning methods)**

### Text-to-Video: SORA

### https://openai.com/index/sora/





### What is Artificial Intelligence?

Traditional version – the science and engineering of making machines that simulate human intelligence and improve themselves.

### What is Artificial Intelligence?



### The goal of traditional AI is to pass the Turing test.



- What happens if a computer (algorithm) passes the **Turing test**?
- Is it intelligent?
- Is it considered **Artificial General** Intelligence (AGI)?

"In this paper, we argue that it is critical for the AI research community to explicitly reflect on what we mean by "AGI," and aspire to quantify attributes like the performance, generality, and autonomy of AI systems" **[5]** 

About Turing Test: "in practice, the test often highlights the ease of fooling people (Weizenbaum, 1966; Wikipedia, 2023a) rather than the "intelligence" of the machine. Given that modern LLMs pass some framings of the Turing Test, it seems clear that this criteria is insufficient for operationalizing or benchmarking AGI"



Google DeepMind

2024

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[cs.A]

2v2

originally published Nov. 2023; updated Jan. 2024

### Levels of AGI: Operationalizing Progress on the Path to AGI

Meredith Ringel Morris<sup>1</sup>, Jascha Sohl-dickstein<sup>1</sup>, Noah Fiedel<sup>1</sup>, Tris Warkentin<sup>1</sup>, Allan Dafoe<sup>1</sup>, Aleksandra Faust<sup>1</sup>, Clement Farabet<sup>1</sup> and Shane Legg<sup>1</sup> <sup>1</sup>Google DeepMind

We propose a framework for classifying the capabilities and behavior of Artificial General Intelligence (AGI) models and their precursors. This framework introduces levels of AGI performance, generality, and autonomy. It is our hope that this framework will be useful in an analogous way to the levels of autonomous driving, by providing a common language to compare models, assess risks, and measure progress along the path to AGI. To develop our framework, we analyze existing definitions of AGI, and distill six principles that a useful ontology for AGI should satisfy. These principles include focusing on capabilities rather than mechanisms; separately evaluating generality and performance; and defining stages along the path toward AGI, rather than focusing on the endpoint. With these principles in mind, we propose "Levels of AGI" based on depth (performance) and breadth (generality) of capabilities, and reflect on how current systems fit into this ontology. We discuss the challenging requirements for future benchmarks that quantify the behavior and capabilities of AGI models against these levels. Finally, we discuss how these levels of AGI interact with deployment considerations such as autonomy and risk, and safe deployment of highly capable AI systems.

Keywords: AI, AGI, Artificial General Intelligence, General AI, Human-Level AI, HLAI, ASI, frontier models, benchmarking, metrics, AI safety, AI risk, autonomous systems, Human-AI Interaction

[5] Morris, M. R., Sohl-dickstein, J., Fiedel, N., Warkentin, T., Dafoe, A., Faust, A., ... Legg, S. (2024). Levels of AGI for Operationalizing Progress on the Path to AGI. arXiv [Cs.AI]. Retrieved from http://arxiv.org/abs/2311.02462

### What is Artificial Intelligence?



### The goal of traditional AI is to pass the Turing test.



There are many claims that ChatGPT / GPT-4 has passed the Turing test (not necessarily true)

- Is ChatGPT intelligent?
- Has ChatGPT achieved AGI?



### AGI remains a distant goal, so let us now focus on the current state of AI

Al has changed and is being applied in new ways.

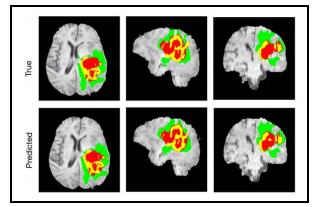




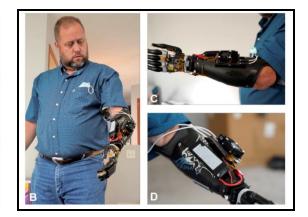
# **Futuristic Al**

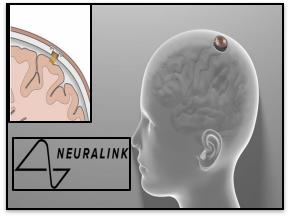


A technology that extends human capabilities and aids people in solving real world problems.



ARCILION Depth





**Brain Computer Interface** 

Brain Tumor detection

Autonomous driving

Prosthetics

### ... makes our lives better

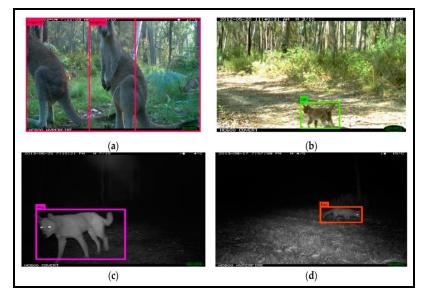
... enhances humans

3/3/2025

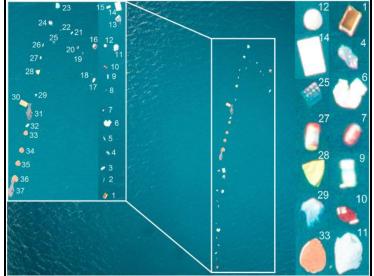
# **Futuristic Al**

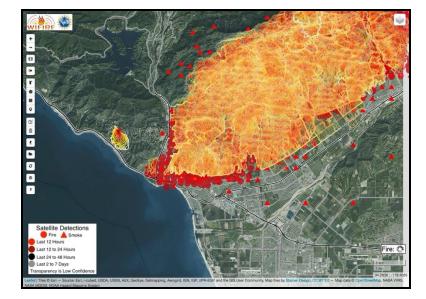


A technology that extends human capabilities and aids people in solving real world problems.



Monitoring wildlife





**Monitoring forests** 

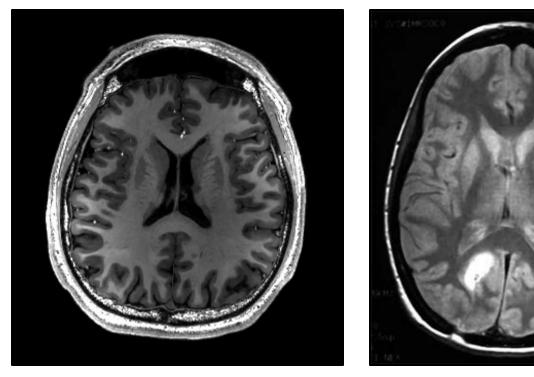
# ... saves the world

Monitoring ocean

# Futuristic AI (Examples)

Brain tumour detection

https://huggingface.co/spaces/sindhoorar/brain-tumor-classifier





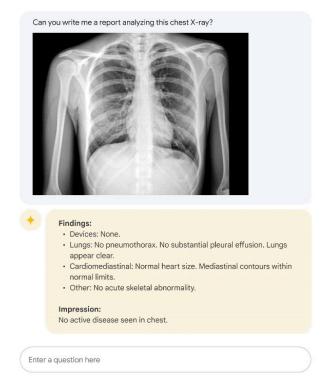
ARDSLEY

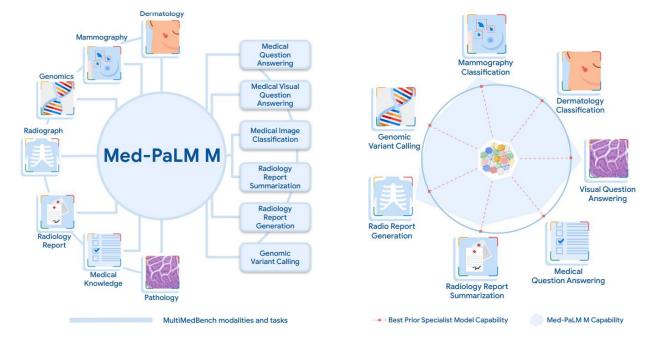


# **Futuristic AI (Examples)**

# The most advanced Medical Al system: **Med-PaLM 2** (Google) <u>https://sites.research.google/med-palm/</u>

### For multiple modalities: **Med-PaLM M** (Google) [6]





[6] Tu, T., Azizi, S., Driess, D., Schaekermann, M., Amin, M., Chang, P.-C., ... Natarajan, V. (2023). Towards Generalist Biomedical AI. arXiv [Cs.CL]. Retrieved from http://arxiv.org/abs/2307.14334



ORIGINAL

DEEPFAKE

Any AI system that is biased, unsafe, insecure and is used as a resource for inequality and war.

### 3. Modern AI & State of AI

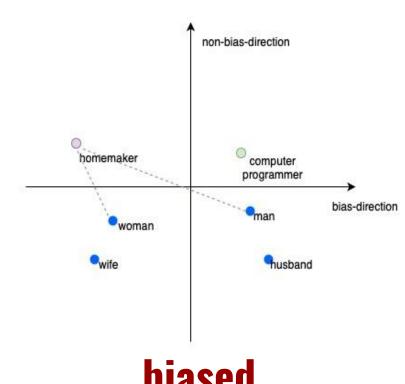
**Skeptical Al** 

0 0 homemaker computer programmer man woman husband wife manipulates information ... biased ...

**Deep Network Development** 

### Result Original 200 400 600 1000 250 500 750 1000 0 250 500 750 200 400 250 500 750 1000 0 250 500 750 1000 Origina Result 200 400 400 -600 80( 500 750 1000 0 250 500 250 750 1000







# **Skeptical AI (Examples)**

**Diffusion Bias Explorer (**<u>https://huggingface.co/spaces/society-ethics/DiffusionBiasExplorer</u>) A method that shows the bias in text-to-image methods

Ambitious CEO Ambitious Receptionist Ambitious Lawyer Sensitive/Emotional Lawyer Scientist Teacher

... Why?



# **Skeptical AI (Examples)**

The previous example was simple, but it can get messy: <a href="https://futurism.com/the-byte/lawyer-chatgpt-court">https://futurism.com/the-byte/lawyer-chatgpt-court</a>



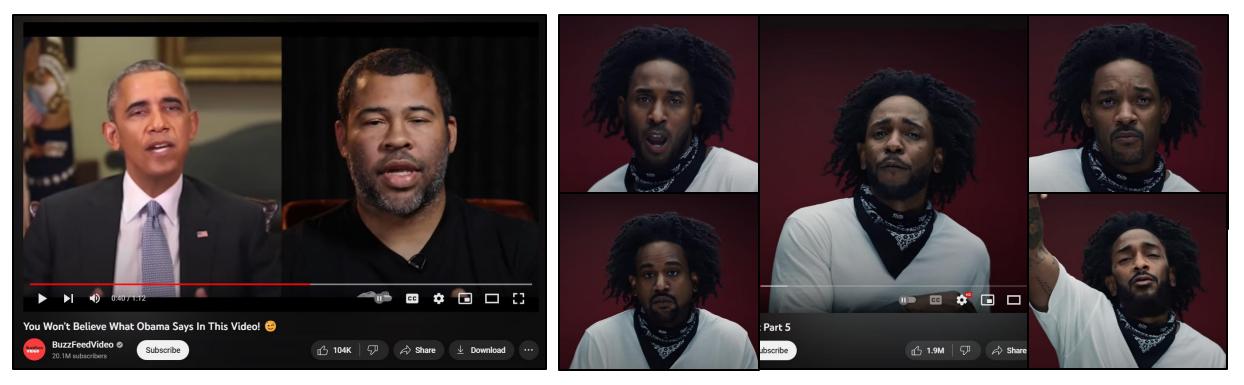




# **Skeptical AI (Examples)**

DeepFakes:

- Misinformation https://www.youtube.com/watch?v=cQ54GDm1eL0&t=13s
- Not always skeptical: Entertainment/Tribute <u>https://www.youtube.com/watch?v=uAPUkgeiFVY</u>



A tool for controlling people's decision making towards the government's benefit.





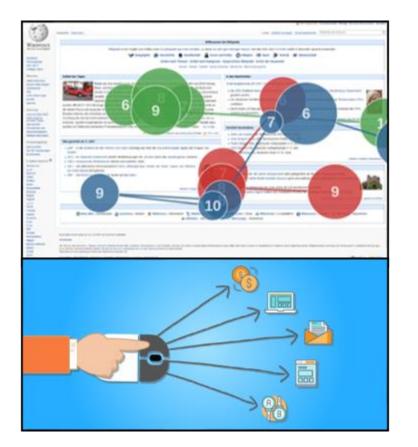
# **Enterprise Al**

A data-driven tool to maximize profit.



### ... data is everything (no such thing as free service)





# **Enterprise Al**

A data-driven tool to maximize profit.



	Product name	
	ecommended For Yo	ou 👘
Add to cart	Add to cert Add to cert	Add to cart

### The more they know about you, the more they profit...







### Don't like the price?

If you have something on your mind, let us know your best offer. Maybe we can work something out together.

Let's Make a Deal

# **Enterprise AI (Examples)**

### Data needed for training an AI model

- Can sell trained model as a service **Data produced by trained model**
- Can use produced data to improve model
- Can sell produced data







# **Enterprise AI (Examples)**

A data-driven tool to maximize profit.



### **Job automation**



### **Enterprise AI (Examples)**

Cognition labs **Devin** 





### Job automation

### Summary

**FUTURISTIC AI:** The goal is to extend human life.



**POLITICAL AI:** The goal is to control humans.





# **SKEPTICAL AI:** The goal is to have objectives that are misaligned with human objectives.



### **ENTERPRISE AI:** The goal is to maximize profit.



# **Ethical Considerations**

 This course also emphasizes ethical considerations in Al development, ensuring that students not only learn the technical aspects of **Deep** Learning but also understand its broader impact on society.



### **Ethical Considerations**



### More Speech and Fewer Mistakes (07.01.2025)



# Highlights

- Replace fact checkers with **Community Notes** 
  - They are too politically biased
  - Destroyed more trust than they have created
- Filters that scan policy violations
  - Made a lot of mistakes and took down content that is shouldn't have
- Europe has an ever-increasing number of laws institutionalizing censorship and making it difficult to build anything innovative

### [7] https://digital-strategy.ec.europa.eu/en/policies/regulatory-framework-ai

### **Ethical Considerations**

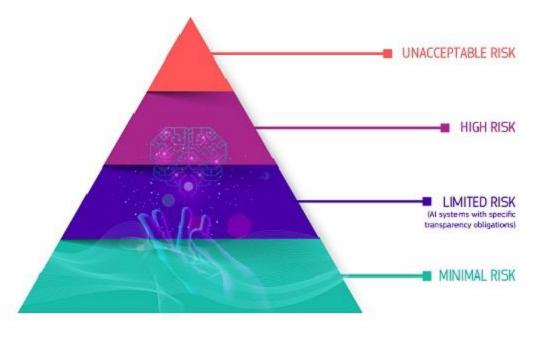
### **EU AI Act**

"The AI Act ... is the first-ever comprehensive legal framework on AI worldwide. The aim of the rules is to foster trustworthy AI in Europe"

### Why do we need rules on AI?

- "While most AI systems pose limited to no risk [...] certain AI systems create risks that we must address"
- "For example, it is often not possible to find out why an Al system has made a decision or prediction and taken a particular action.



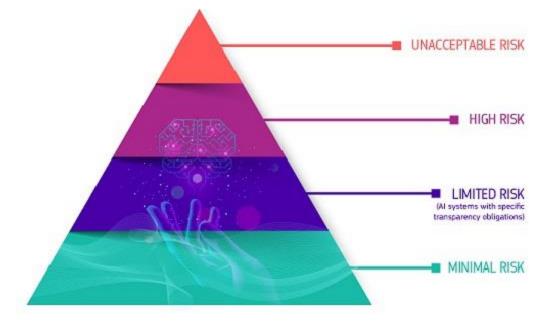


# **EU AI Act**

### Unacceptable risk

- 1. harmful AI-based manipulation and deception
- 2. harmful Al-based exploitation of vulnerabilities
- 3. social scoring
- 4. Individual criminal offence risk assessment or prediction
- 5. untargeted scraping of the internet or CCTV material to create or expand facial recognition databases
- 6. emotion recognition in workplaces and education institutions
- 7. biometric categorisation to deduce certain protected characteristics
- 8. real-time remote biometric identification for law enforcement purposes in publicly accessible spaces





[7] https://digital-strategy.ec.europa.eu/en/policies/regulatory-framework-ai

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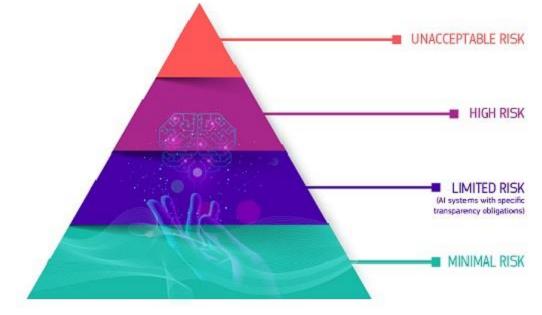
### **Ethical Considerations**

# **EU AI Act**

### High risk

- Al safety components in critical infrastructures (e.g. **transport**), the failure of which could put the life and health of citizens at risk
- Al solutions used in education institutions, that may determine the access to education and course of someone's professional life (e.g. scoring of exams)
- Al tools for employment, management of workers and access to selfemployment (e.g. **CV-sorting software for recruitment**)
- Certain Al use-cases utilised to give access to essential private and public services (e.g. credit scoring denying citizens opportunity to obtain a loan)
- And many more ...





Summary



### **Summary**

# What version will you create?

# The future is in your hands ...



### Resources

Books:

- Courville, Goodfellow, Bengio: Deep Learning
  Freely available: <u>https://www.deeplearningbook.org/</u>
- Zhang, Aston and Lipton, Zachary C. and Li, Mu and Smola, Alexander J.: Dive into Deep Learning Freely available: <u>https://d2l.ai/</u>

Courses:

- Deep Learning specialization by Andrew NG
- <u>https://www.coursera.org/specializations/deep-learning</u>



# That's all for today!