



# Foundations, Methods, Applications and Limitations of Artificial Intelligence

Raja Chatila

Institute of Intelligent Systems and Robotics (ISIR)

Faculty of Sciences and Engineering, Pierre and  
Marie Curie Campus

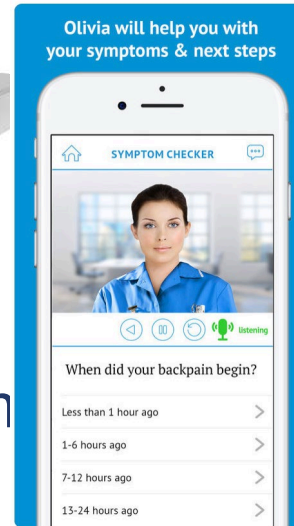
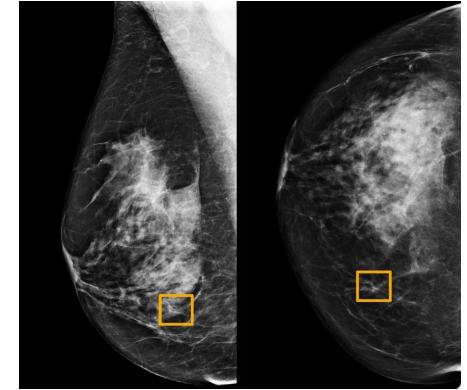
Sorbonne University, Paris, France

[Raja.Chatila@sorbonne-universite.fr](mailto:Raja.Chatila@sorbonne-universite.fr)



# Multiple Applications of AI And Robotics

- Transportation, logistics, delivery
- Healthcare
- Manufacturing
- Agriculture
- Personal services & assistance
- Security
- Recommender systems, advertising
- Recruitment & management
- Insurance & finance
- Justice
- Warfare
- ...



## A face-scanning algorithm increasingly decides whether you deserve the job

HireVue claims it uses **artificial intelligence** to decide who's best for a job. Outside experts call it 'profoundly disturbing.'





# Artificial Intelligence

Machine Learning

Deep Learning

Reinforcement Learning

Robotics

Control Theory

Mechanical Design

Real-time Systems

“Symbolic AI”

Knowledge Representation;

Logical inference and Probabilistic Reasoning;

Problem Solving and Search; Planning



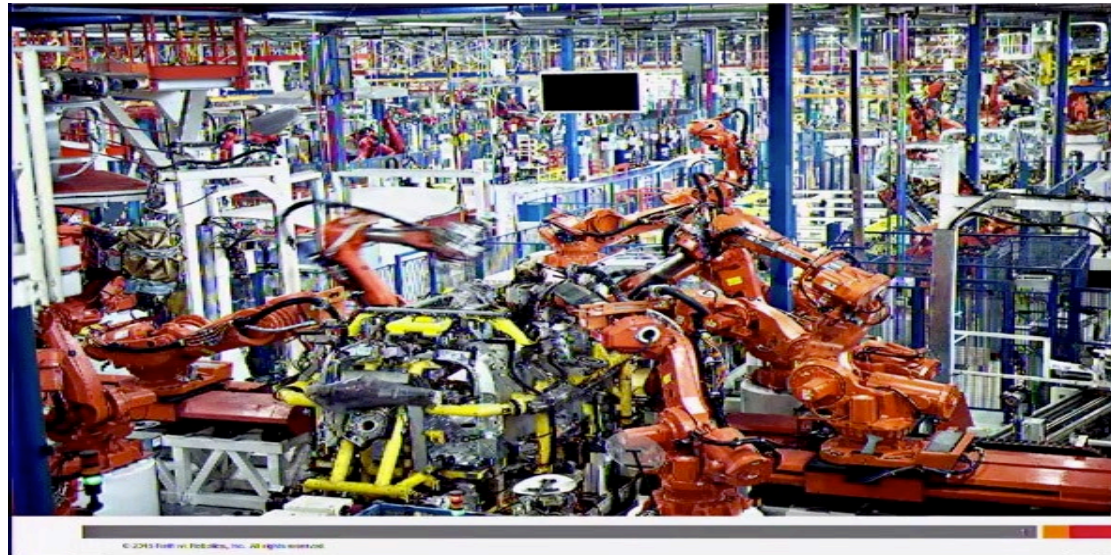
# What is an Computational “Intelligent” System?

- A computational intelligent system is a set of **algorithms designed by humans**, using data (big/small/sensed) to solve [more or less] complex problems in [more or less] complex situations.
- The system might include deductive inference, as well as machine learning processes, *i.e.*, the capability of improving its performance based on data classification to build **statistical models** from data (*e.g.*, deep learning), or on evaluating previous decisions (*e.g.*, reinforcement learning).
- Such systems could be regarded as “autonomous” in a **given domain** and for **specific tasks**, as long as they are capable of accomplishing these tasks despite environment variations within this domain.
- Difference between automated and autonomous systems is related to **complexity** of task and domain, and **importance** of variations





# From Full Robotization to Human-Robot collaborative tasks





# Machine Learning

Statistical data processing and classification

- Use of probability distributions, correlations, ...
  - Use of artificial neural nets as classifiers
  - Optimization algorithms
- 
- Supervised learning: correct answer provided by a truth model.
  - Unsupervised learning: search for regularities in the data
  - Reinforcement Learning: select the most promising action based on rewards

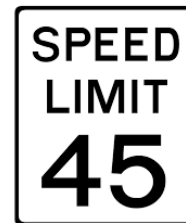




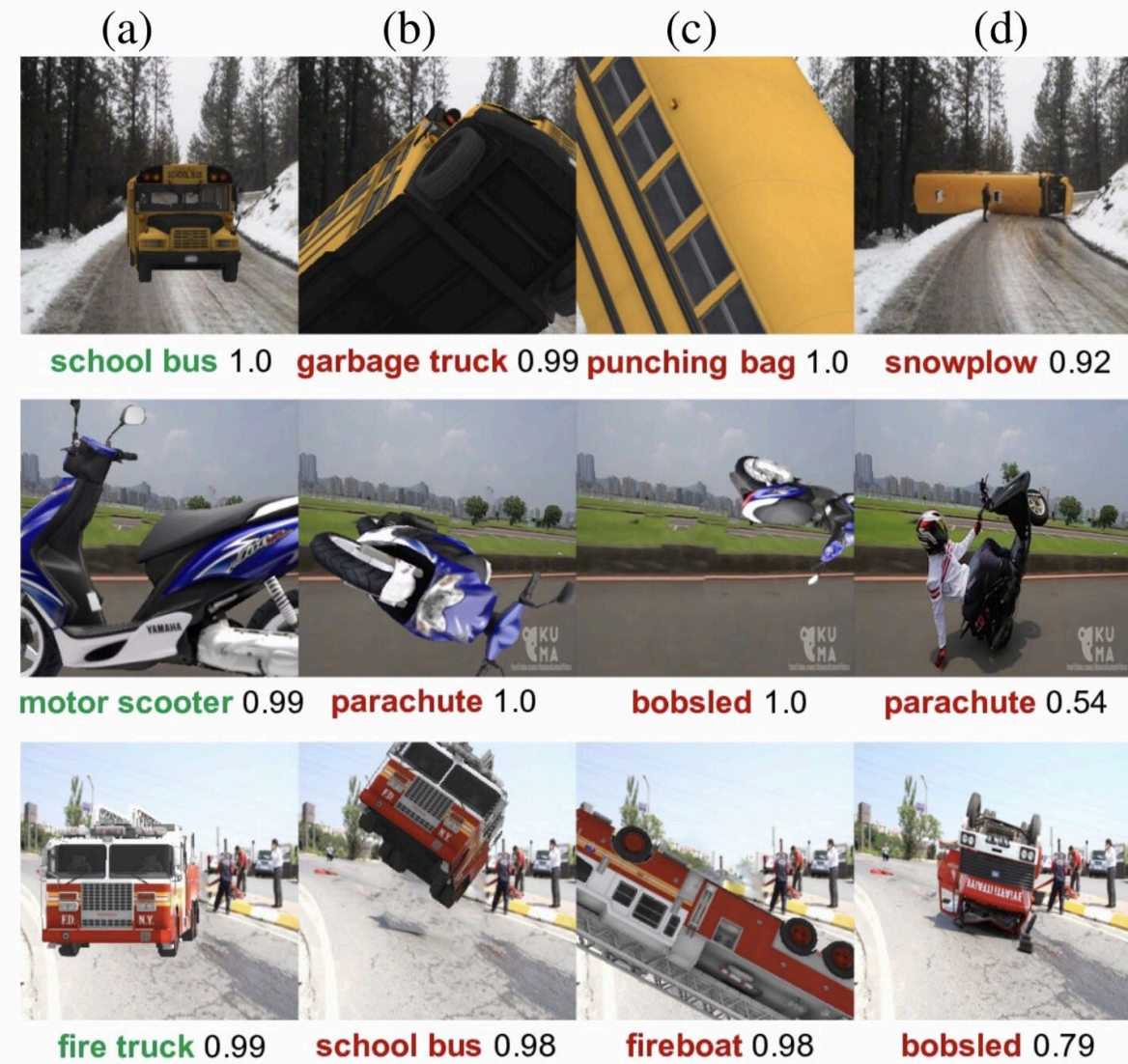
# Deep Learning Limi Robustness



Targeted physical perturbation experiment  
The misclassification target was Speed Limit 45.



Robust Physical-World Attacks on Deep Learning Models K. Eykholt et al. CVPR 2018.



Strike (with) a Pose: Neural Networks Are Easily Fooled by Strange Poses of Familiar Objects. Michael A. Alcorn et al., CVPR 2019



# Issues with Statistical Machine Learning

- Black box: millions/billions of parameters, optimization algorithms, un certified off-the-shelf components
- No solid verification and validation processes or qualification of results
- Quality and representativeness of data. Data Bias
- Bias due to design and architecture choices
- Inappropriate correlations, absence of causality between data and results
- No explicability
- Computational level: No semantics, no understanding of manipulated symbols, no context awareness
- Environmental cost





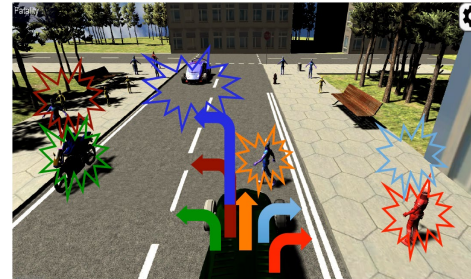
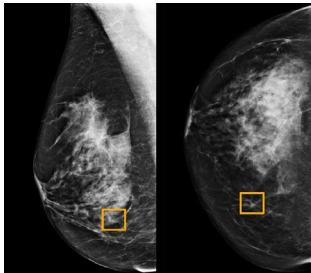
# Risks and Trustworthiness of AI Systems

- No ethical rules in academic AI research
- Advanced AI research in industry without ethical oversight
- Applications in critical domains (healthcare, transport, security...)
- Applications potentially threatening human rights and values (surveillance, opinion manipulation, policing, justice, access to jobs and education, ...)

→ **Need for robustness and safety**

→ **Need for ethics and governance**

} Transparency  
Explainability





# Key Requirements for Trustworthy AI

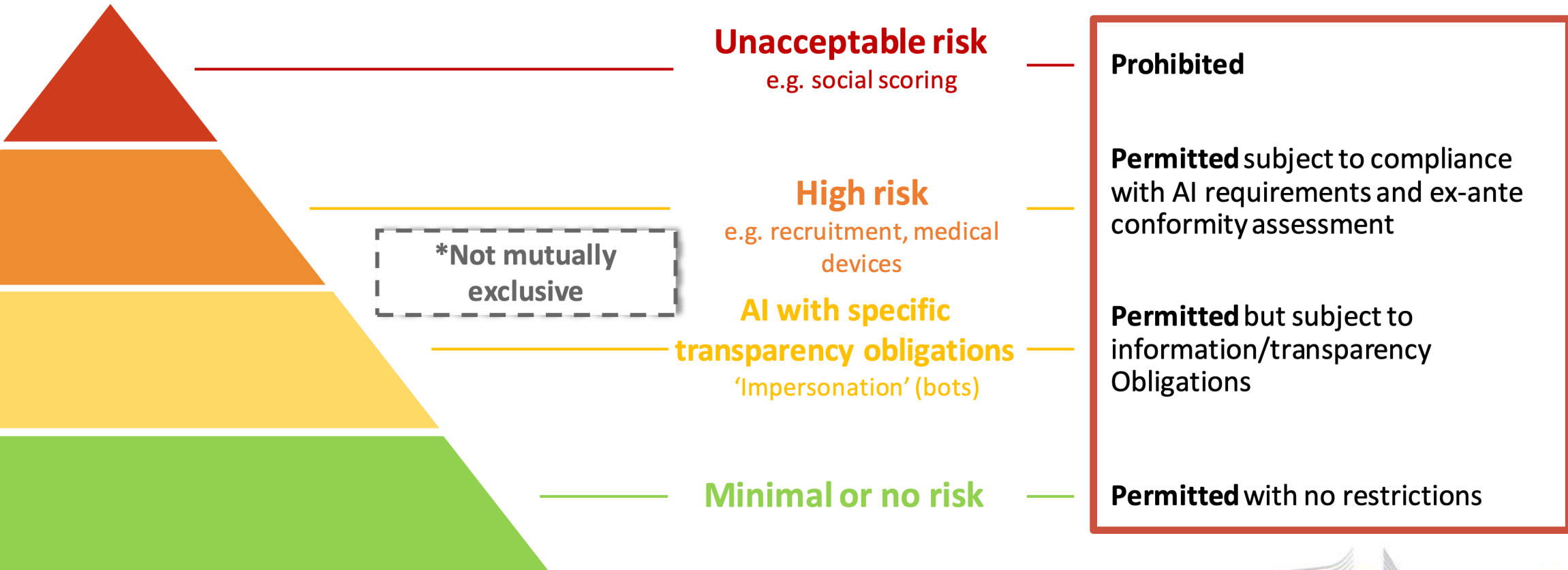
## High-Level Expert Group on AI (EU) - April 2019



1. **Human agency and oversight**- Including respect to fundamental rights, human control
  2. **Technical robustness and safety** - Including resilience to attack and security, fall back plan and general safety, accuracy, reliability and reproducibility
  3. **Privacy and data governance** - Including respect for privacy, quality and integrity of data, and access to data
  4. **Transparency** - Including traceability, **explainability** and communication
  5. **Diversity, non-discrimination and fairness** - Including the avoidance of unfair bias, accessibility and universal design, and stakeholder participation
  6. **Societal and environmental wellbeing** - Including sustainability and environmental friendliness, social impact, society and democracy
  7. **Accountability** - Including auditability, minimisation and reporting of negative impact, trade-offs and redress.
- Tool: Assessment List for Trustworthy AI - ALTAI

# A risk-based approach to regulation

EU Legislative proposal (21/04/2021)



Courtesy L. Sioli



Courtesy L. Sioli





# Main Takeaways

- AI and Robotics contributes to increase productivity through physical process or software automation
- They enable to achieve tasks that are too repetitive, or were not achievable before (too dangerous, too costly, too difficult for humans) and create new services
- Exploit available massive data (images, scientific data, text, ...)
- But AI is no silver bullet for many application. Avoid technical solutionism.
- AI systems using machine learning need to be made robust and resilient
- Explainability is essential to build trust in AI systems
- Appropriate design approaches, governance frameworks, auditing and certification of AI systems are necessary.