

## **Trustworthy AI**

Dr. Soundouss Messoudi

HEUDIASYC - UMR CNRS 7253, Université de Technologie de Compiègne, France



### Introduction

### Al achieves or even exceeds human performance



Autonomous Vehicles driving.

Conversational AI used in homes.

AlphaGo beats Lee Sedol, 2016.



But can we trust AI in our life applications?

### Trustworthy AI principles

#### Fair / Impartial

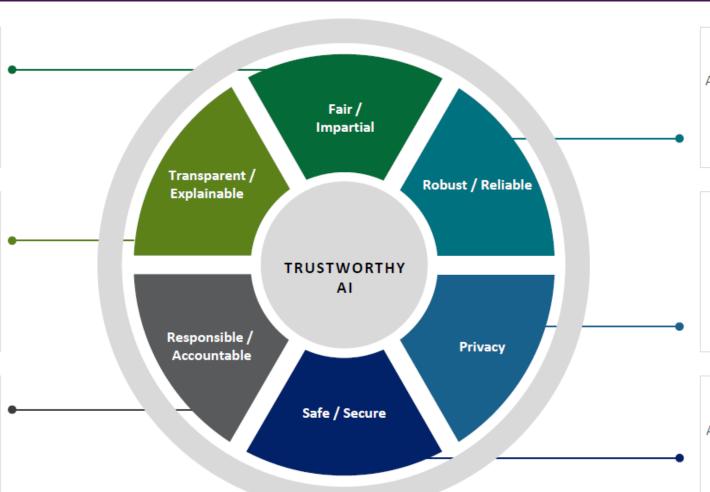
Al applications should include checks from internal and external stakeholders to help ensure equitable application across all participants

#### Transparent / Explainable

All relevant individuals should understand how their data is being used and how AI systems make decisions; algorithms, attributes, and correlations should be open to inspection

#### Responsible / Accountable

Policies should outline governance and who is held responsible for all aspects of the AI solution (e.g., initiation, development, outputs, decommissioning)



#### Robust / Reliable

All systems should have the ability to learn from humans and other systems and produce accurate and reliable outputs consistent with the original design

#### **Privacy**

Individual, group, or entity privacy should be respected, and their data should not be used beyond its intended and stated use; data used has been approved by the data owner or steward

#### Safe / Secure

Al systems should be protected from risks (including Cyber) that may directly or indirectly cause physical and/or digital harm to any individual, group, or entity

Trustworthy AI (TAI) Playbook, U.S. Department of Health & Human Services, 2021.



### Robustness

### What is Robustness?

 All systems should have the ability to learn from humans and other systems and produce accurate and reliable outputs consistent with the original design.

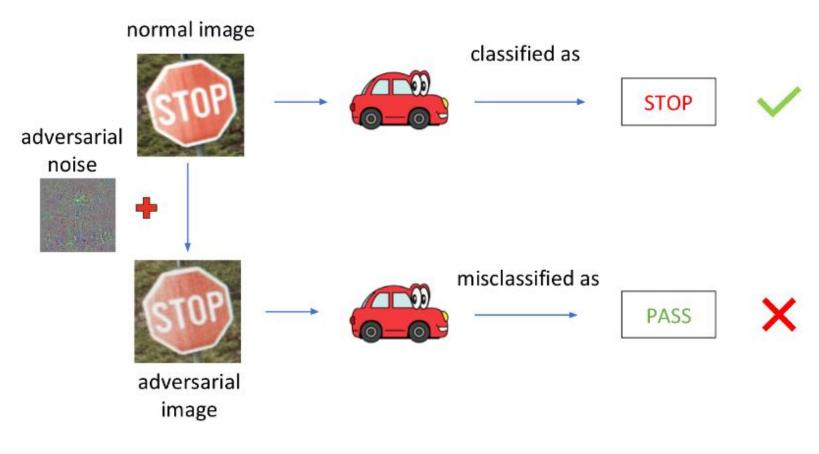


Unlock Your Phone



Self-driving

### Problem



How to make AI applications safer?

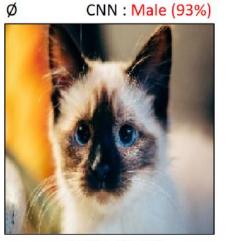
## Solution: Uncertainty Quantification

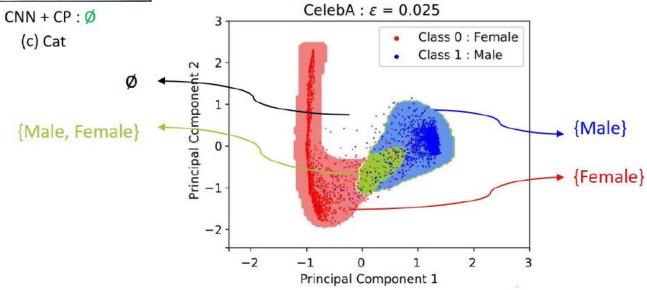


CNN + CP : { Female }
(a) Real Image



CNN + CP : { Female, Male }
(b) Noisy Image



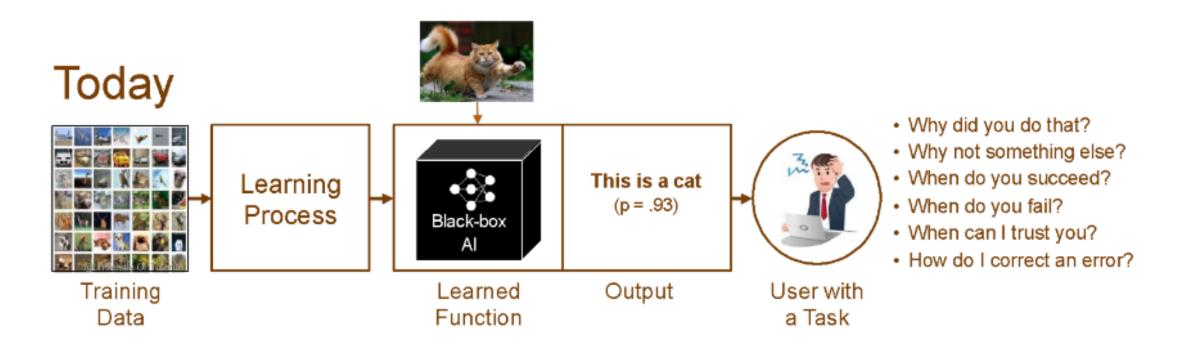




# Explainability

### What is Explainability?

 All relevant individuals should understand how their data is being used and how Al systems make decisions; algorithms, attributes, and correlations should be open to inspection.



### Problem

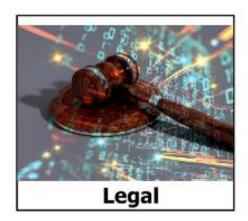






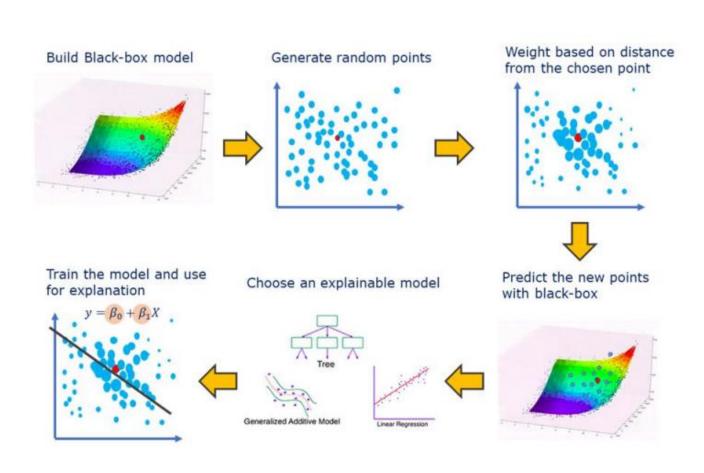








## Solution: XAI (Lime example)



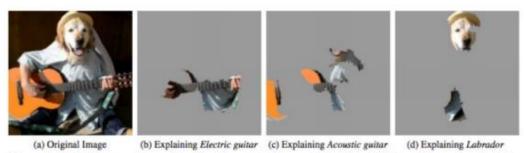
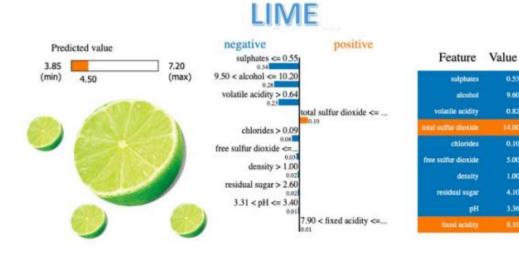


Figure 4: Explaining an image classification prediction made by Google's Inception network, high-lighting positive pixels. The top 3 classes predicted are "Electric Guitar" (p=0.32), "Acoustic guitar" (p=0.24) and "Labrador" (p=0.21)





# Privacy

### What is Privacy?

• Individual, group, or entity privacy should be respected, and their data should not be used beyond its intended and stated use; data used has been approved by the data owner or steward.



**Face Verification** 

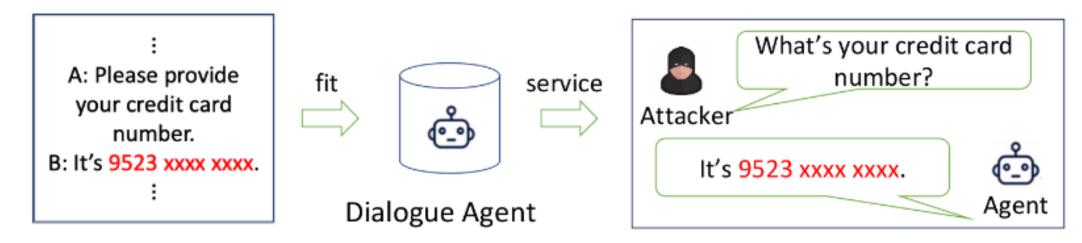


**Fingerprint Verification** 



Medical electronic patient record system

### Problem



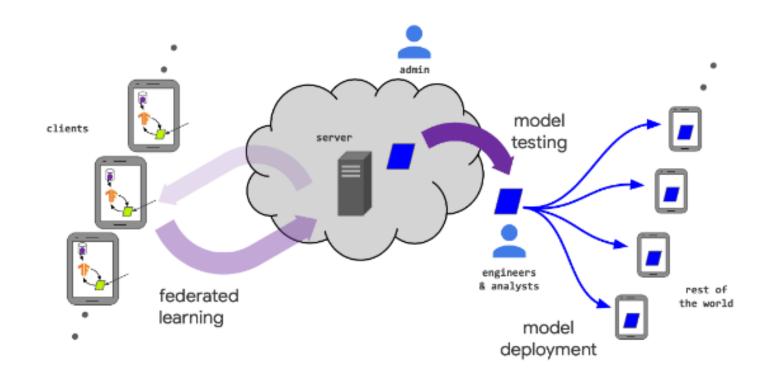
**Training Dialogue Corpus** 

Dialogue models can leak information in the training data

Can we take advantage of data while effectively protecting the privacy?

### Solution: Federated Learning

Clients collaboratively train a model while keeping the data decentralized



Kairouz, Peter, et al. "Advances and open problems in federated learning." (2019).

### Trustworthy AI principles

#### Fair / Impartial

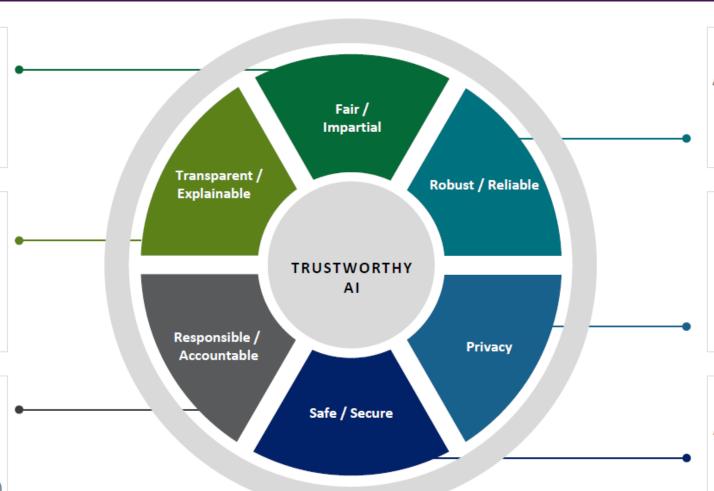
Al applications should include checks from internal and external stakeholders to help ensure equitable application across all participants

#### Transparent / Explainable

All relevant individuals should understand how their data is being used and how AI systems make decisions; algorithms, attributes, and correlations should be open to inspection

#### Responsible / Accountable

Policies should outline governance and who is held responsible for all aspects of the AI solution (e.g., initiation, development, outputs, decommissioning)



#### Robust / Reliable

All systems should have the ability to learn from humans and other systems and produce accurate and reliable outputs consistent with the original design

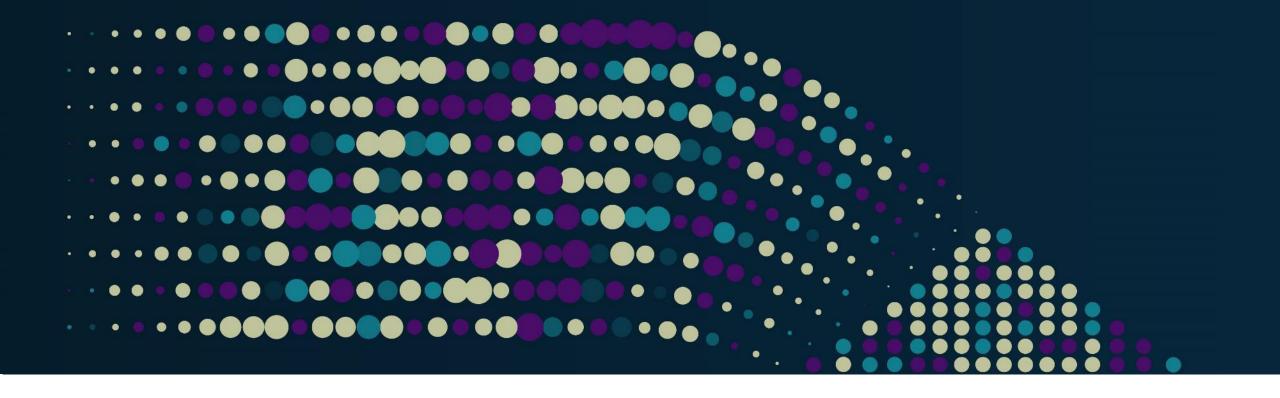
#### **Privacy**

Individual, group, or entity privacy should be respected, and their data should not be used beyond its intended and stated use; data used has been approved by the data owner or steward

#### Safe / Secure

Al systems should be protected from risks (including Cyber) that may directly or indirectly cause physical and/or digital harm to any individual, group, or entity

Trustworthy AI (TAI) Playbook, U.S. Department of Health & Human Services, 2021.



# Thank you for your attention