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# Trustworthy AI in Video Surveillance: The IMMAGINA Project

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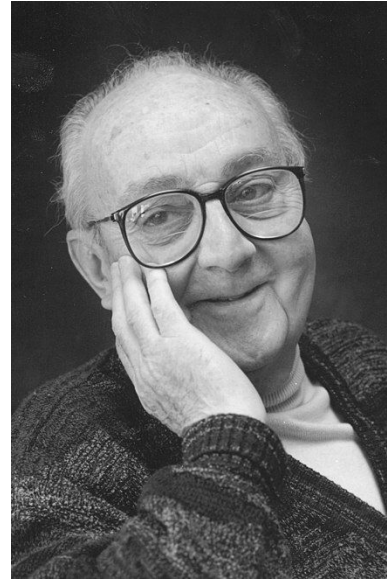
3rd National Conference on Artificial Intelligence - Pisa, 30/05/2023



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*“All models are **wrong**  
but some are **useful**,”*

George Box, 1976



# Why Are All Models Wrong?

Because the world has many sources of **Uncertainty**

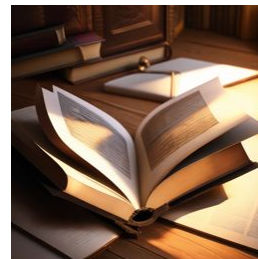
**Intrinsic Randomness = Aleatoric Uncertainty**

- Exact predictions may not always exist
- From the Latin “Aleator”, i.e. “Dice Player”



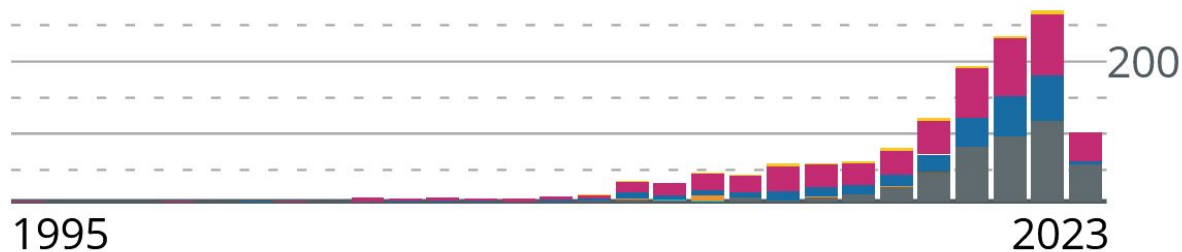
**Lack of Knowledge = Epistemic Uncertainty**

- We do not have perfect knowledge
- from the greek “Episteme”, i.e. “Knowledge”

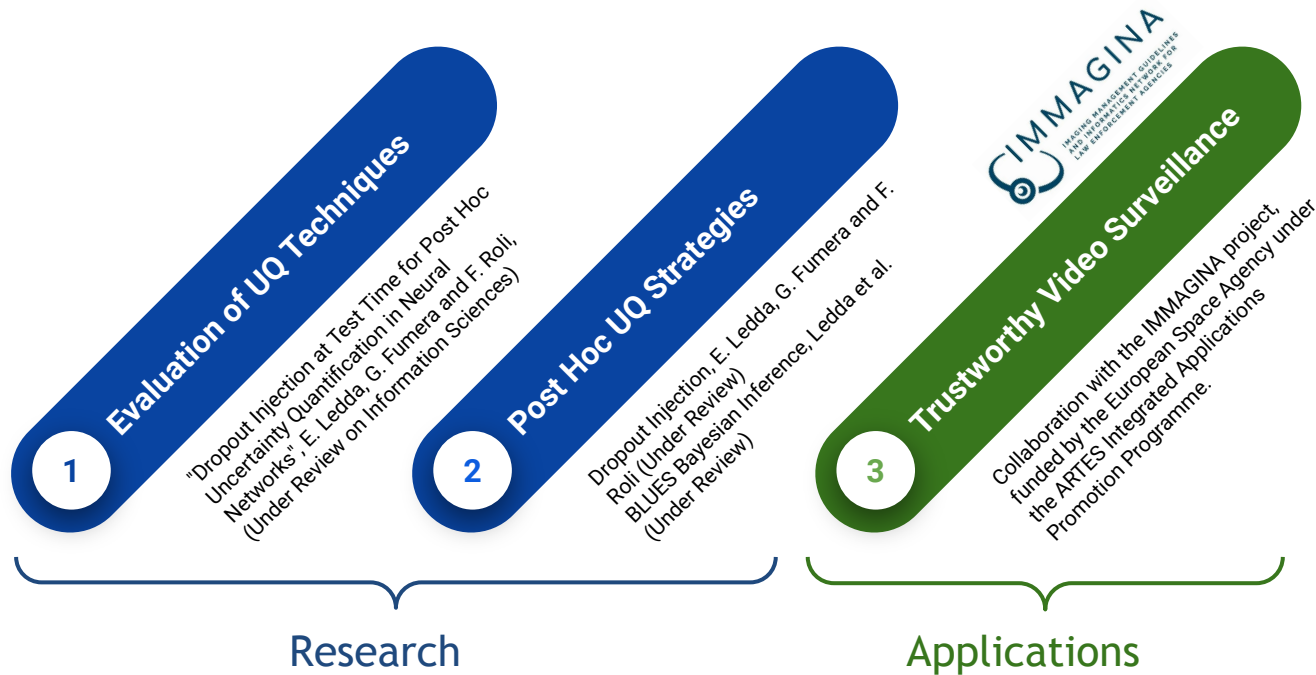


# Trustworthiness from the Uncertainty Perspective

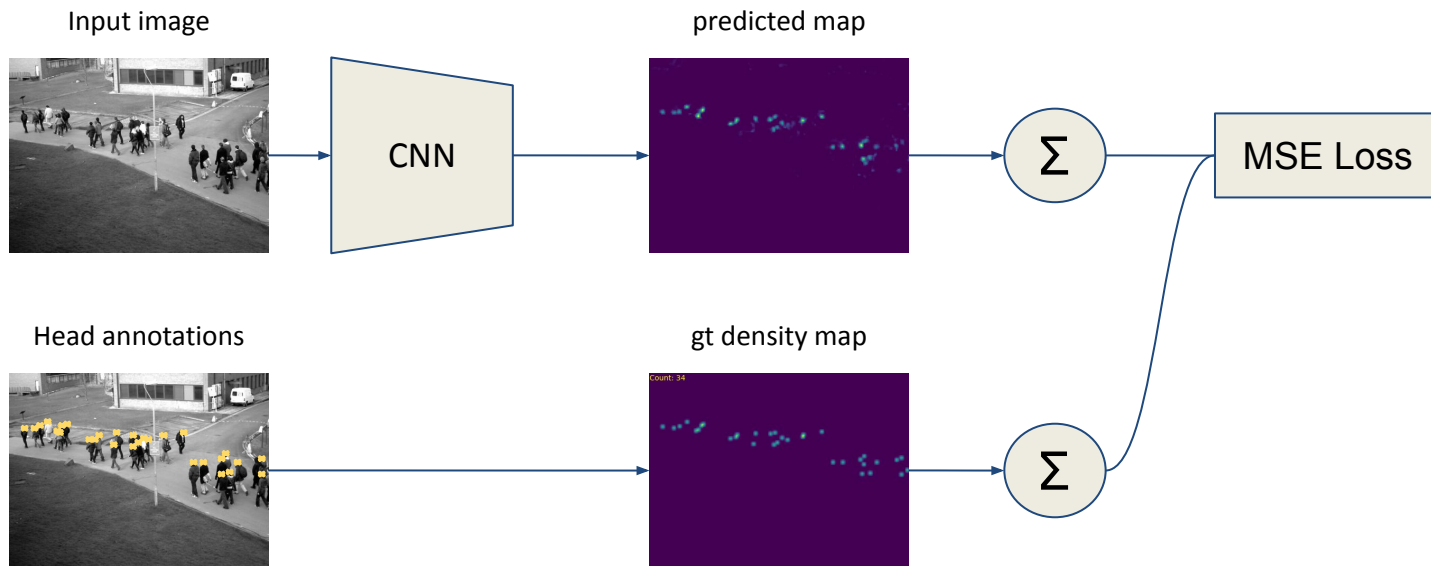
- **Trustworthy AI** as an AI which “knows when it does not know”
- Let people know when to **Trust** a model’s prediction: hence, when a model is **wrong** and when it is **useful**
- Challenging, still rising topic in AI



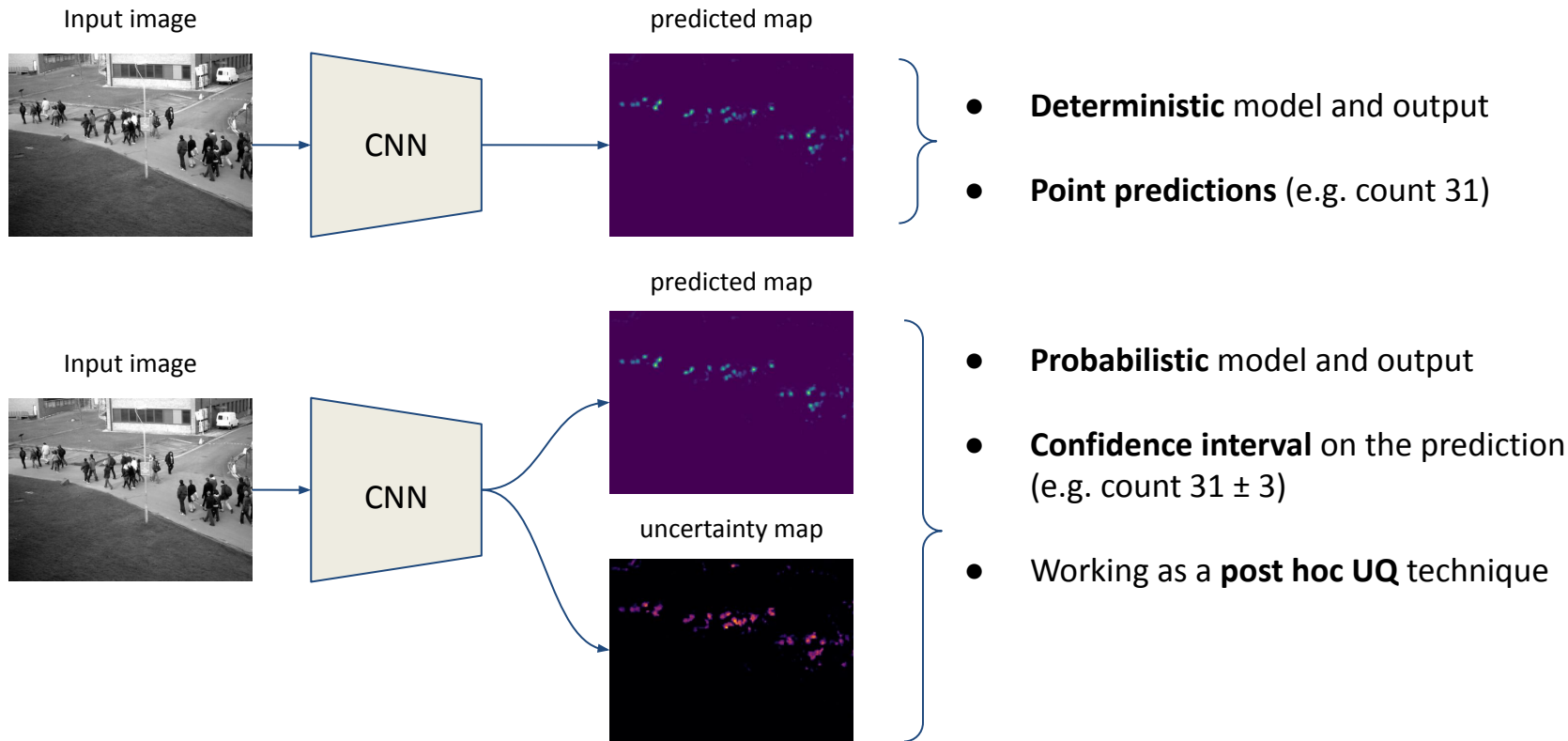
# Our Line of Research and Application



# Crowd Counting and Density Estimation

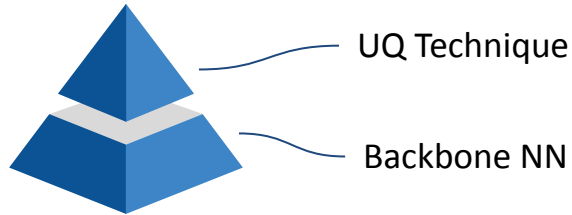


# Uncertainty Quantification for Crowd Counting

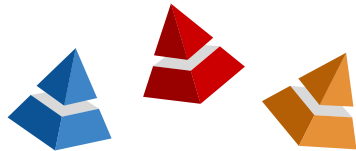


# Post Hoc vs Ad Hoc Uncertainty Quantification

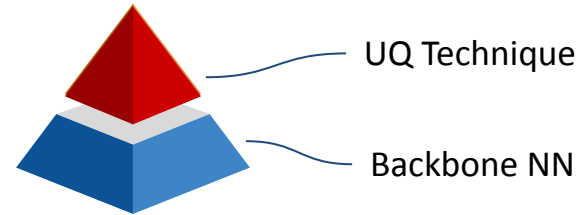
## Ad Hoc Techniques



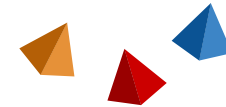
- Integrated inside the network at **training time**
- Changing UQ technique **requires re-train** the backbone



## Post Hoc Techniques

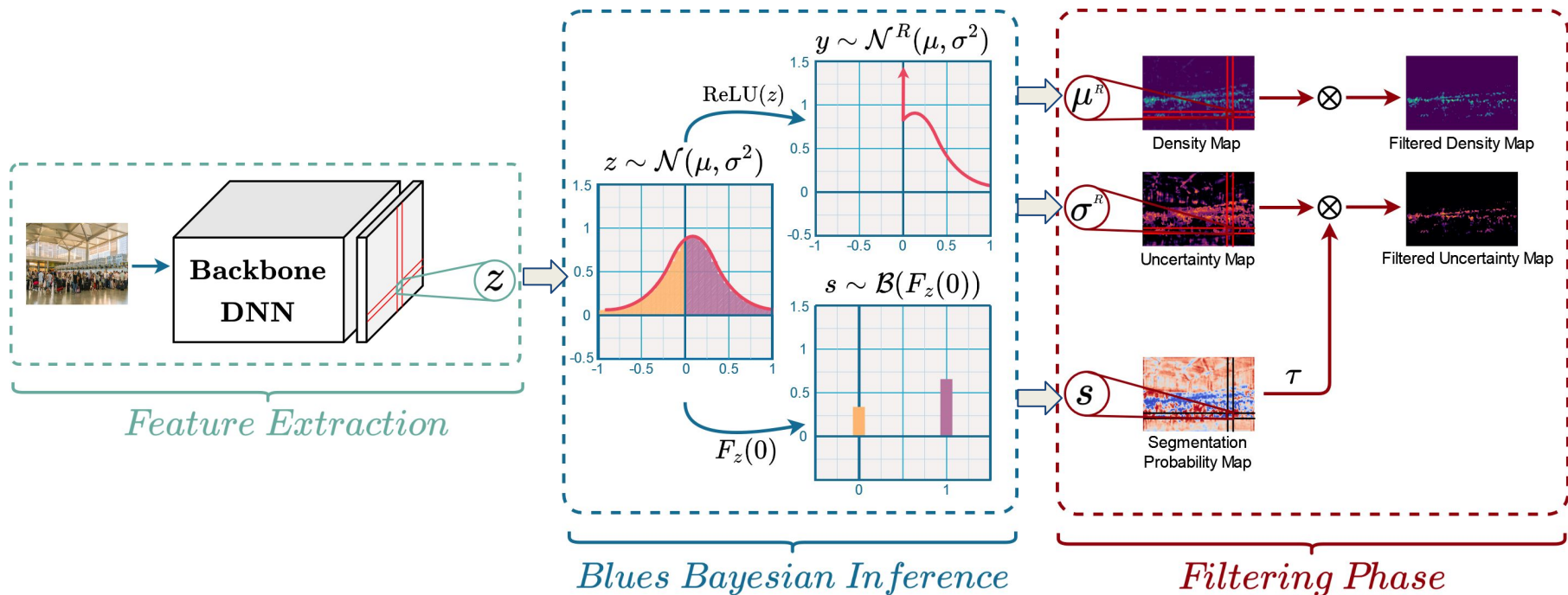


- Integrated on an **already trained** neural network
- Changing UQ technique **does not require to re-train** the backbone
- Act as a **plug-in**

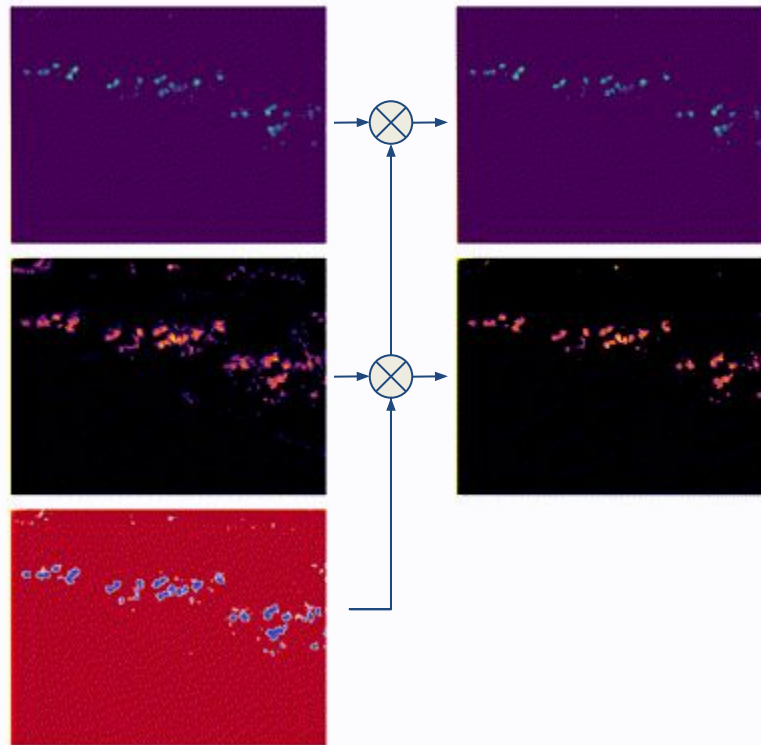
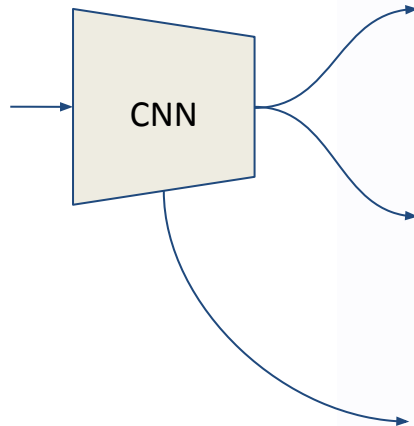




# Steps Ahead: Before-ReLU-Estimates Bayesian Inference



# Applicative Results





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# Thank you for the attention!



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