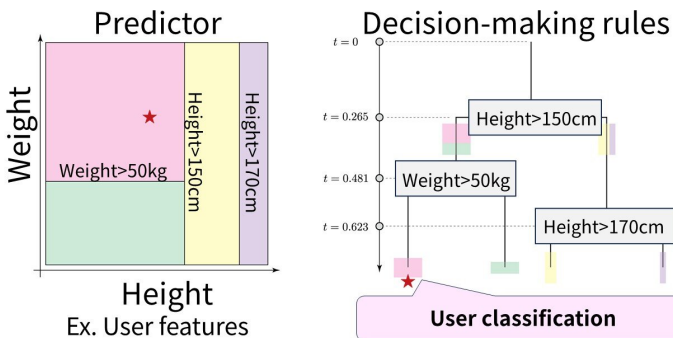


Abstract

Decision trees have been playing an important role in machine learning tasks that require interpretability and transparency, such as in finance and biomedical fields. In recent years, **the existence of multiple decision tree candidates with comparable performance but different qualities**, known as the Rashomon set, has attracted attention as a topic that further promotes the interpretability and transparency of decision trees. In this presentation, we explore a method for exploring the Rashomon set for decision trees. Specifically, we propose a quantum extension of decision trees in order to **introduce quantum effects** as a mechanism for multiple influential decision trees of seemingly different quality in a Rashomon set to share potentially useful clues with each other.

Decision tree for classification/regression

Decision tree: AI model with explainable and interpretable decision-making rules.



■ **Challenge of general-purpose AIs :**

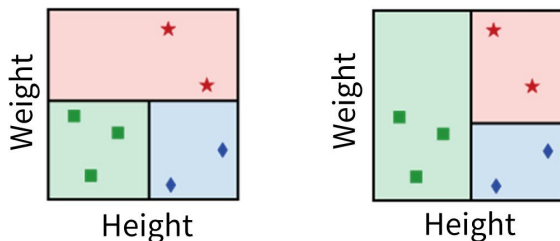
- It is not easy for engineers to gain explainable and interpretable insights from the trained AIs.

■ **Advantage of decision tree :**

- It is tractable for engineers calculate the uncertainty of decision-making rules from AI.

Existence of multiple influential trees

Rashomon effect : Multiple trees have the same level of model performance but are of different quality.

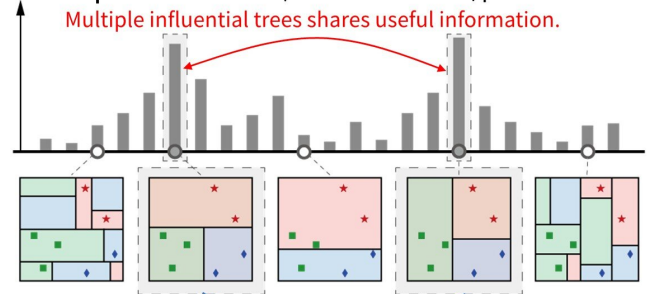


Examples of decision trees that classify 6 data into 3 classes

Our insight: Quantum superposition

Inspired by quantum computation, we introduce the **quantum superposition** notion into the decision trees as a mechanism that **allows multiple influential decision trees to coexist as a single state**, whereas in classical system, a single state generally corresponds to a single decision tree.

Model performance (ex. Classification/prediction)



Rashomon set (Trees with Rashomon effect)

Extraction from mixture

Averaging

Coexistence of multiple influential trees



(a) Mixture



(b) Ensemble
(Conventional)

$$\frac{1}{\sqrt{2}} \left(\text{Tree 1} + \text{Tree 2} \right)$$

(c) **Superposition**
(Proposed)

■ **Our demonstrations :**

1. **Learning:** Illustrative animation shows how to share useful knowledge between multiple decision trees.
2. **Visualization:** Our system shows illustrative 2D embeddings of multiple influential decision trees for 5 biological real-world datasets.

References

[1] M. Nakano, K. Komiya, H. Sakuma, T. Sato, T. Iwata, K. Kashino, "Mondrian Embeddings for Visualization of Decision Tree Ensembles," in *Proc. the 47th annual international conference of the IEEE Engineering in Medicine and Biology Society*.

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