



# Ensemble method (1)

## Random Forest

# Ensemble

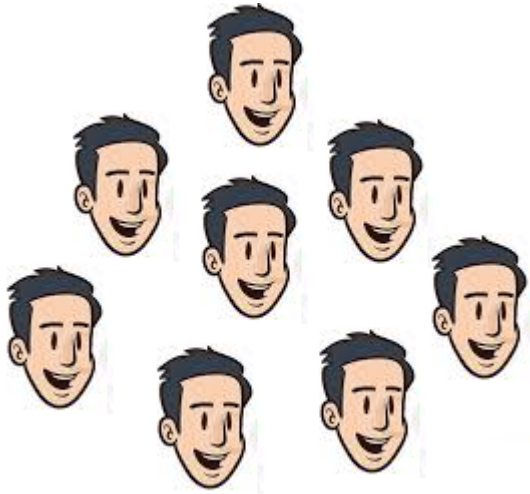
What is an Ensemble?



# What is an Ensemble?

- An individual model might be a weak-learner,
- Aggregated models can predict better

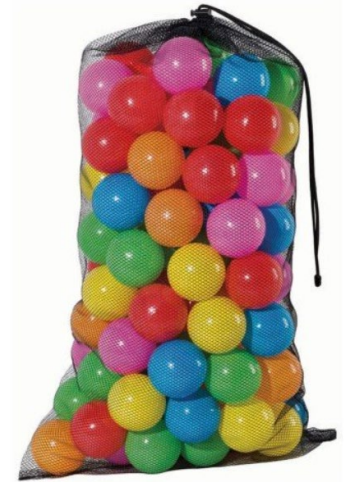
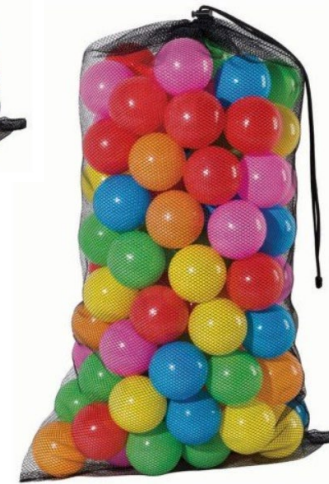
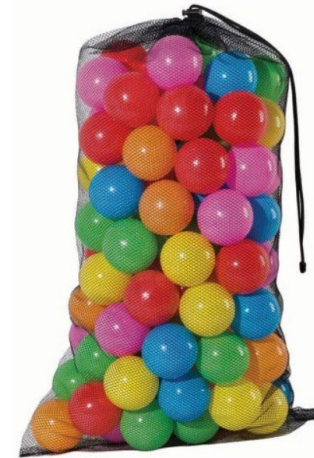
# Diversity matters



## How do we diversify our models?

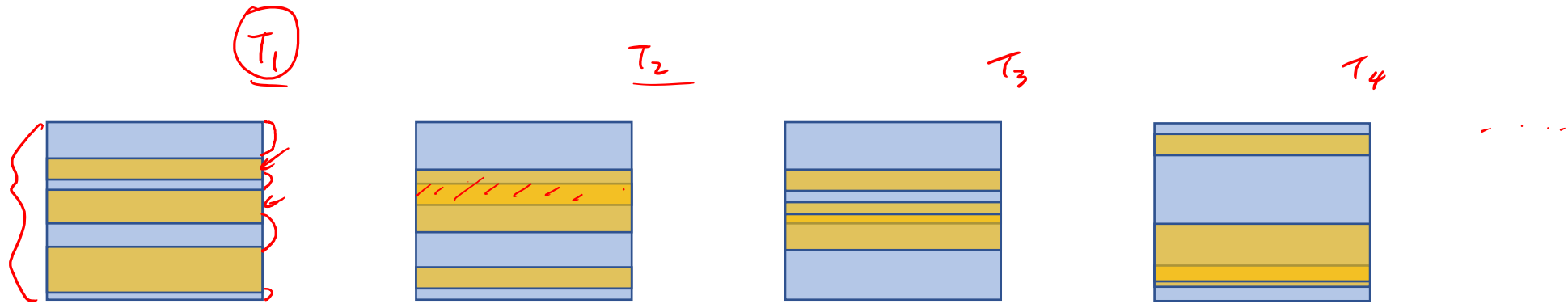
- **Idea1**: Models trained on different data subset

# Bagging





# Bagging (Bootstrap-Aggregation)



**STEP1:** Randomly sample a subset of training data with replacement (Bootstrap)

**STEP2:** Grow a tree (without pruning) on the subset of data

**STEP3:** Ensemble the result (regression : average, classification : vote)

Out of Bag error (OOB) : test the grown tree on the rest of data, then average



# Random Forest





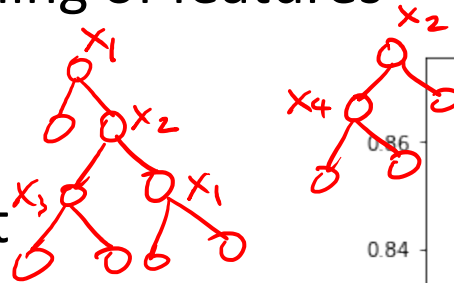
Bagging : random sampling of data

+

Decorrelation : random sampling of features

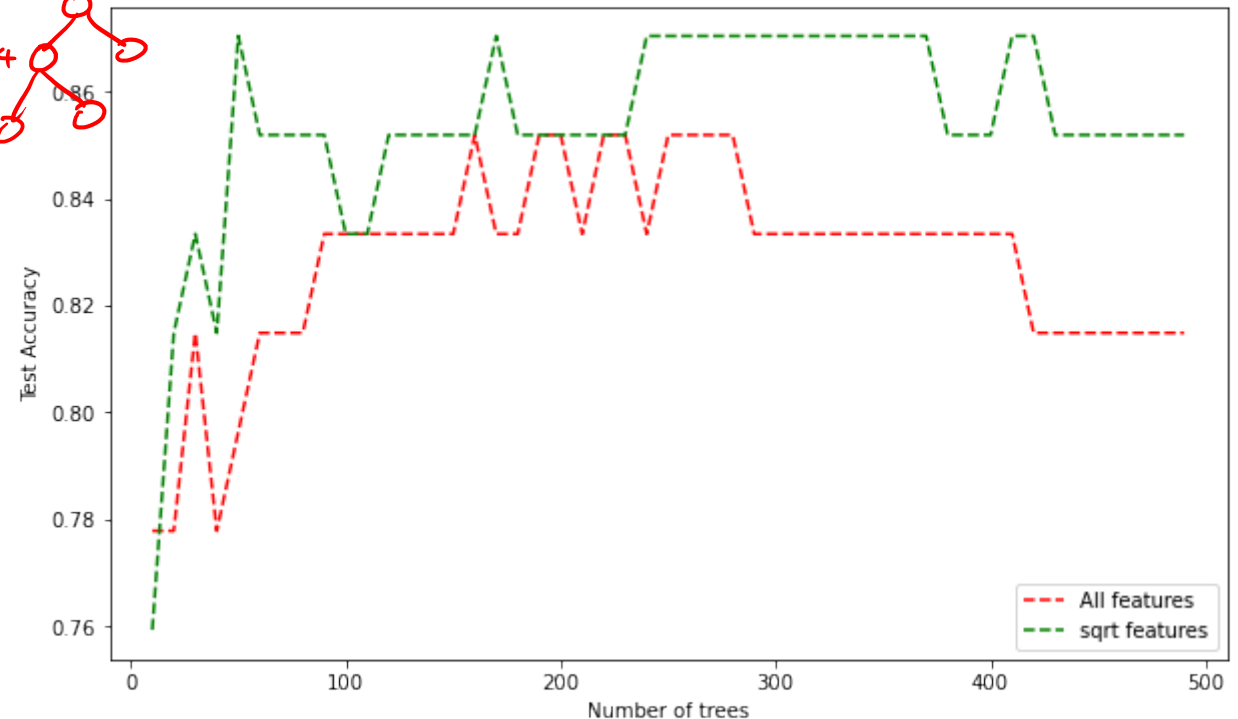
II

Random Forest

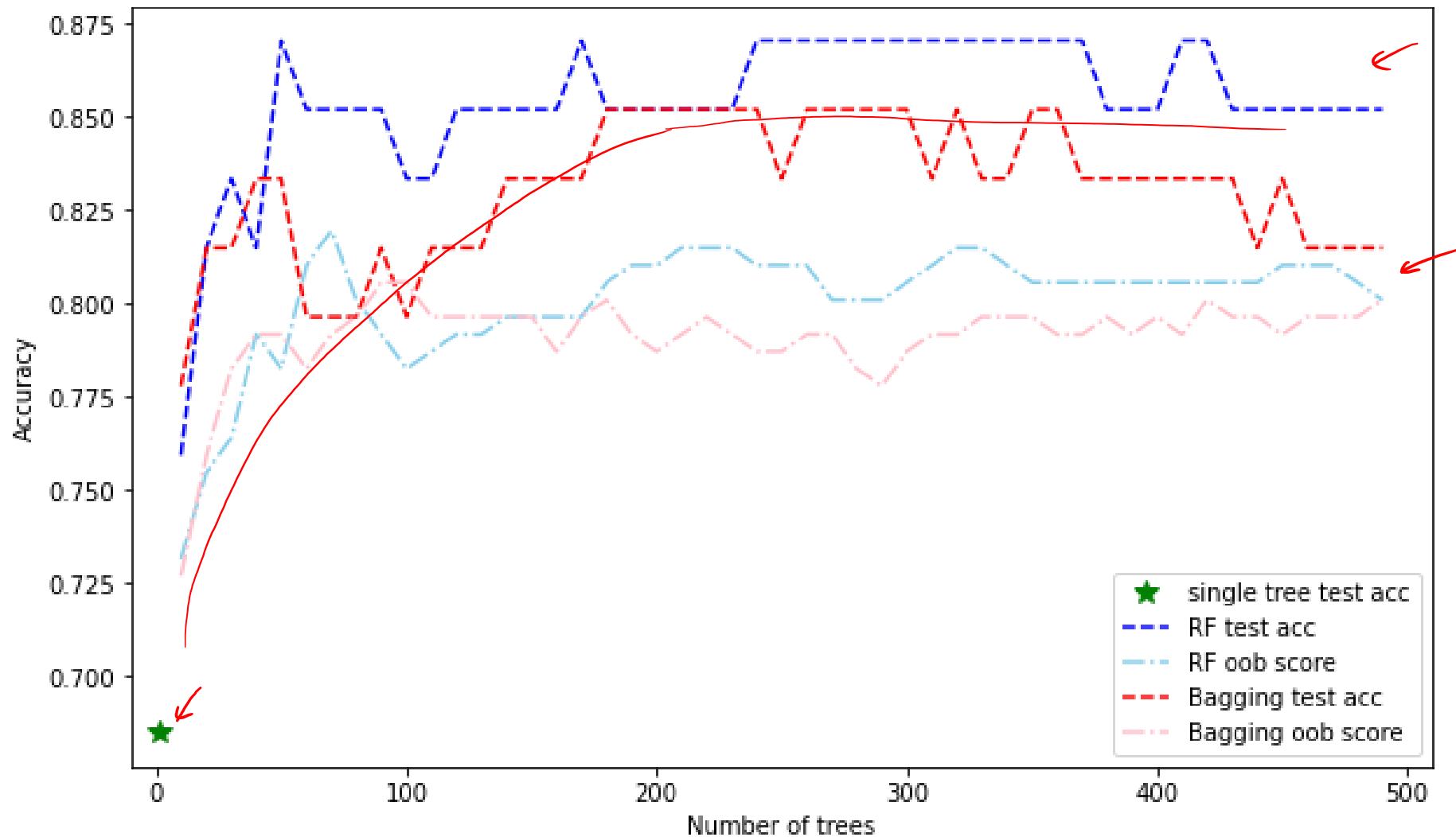


How do we sample features?

-> Rule of thumb :  $\sqrt{n}$



# Power of an ensemble of trees



# Built-in feature importance

