



**BATCH : B 150 Data Science**  
**LESSON : Machine Learning**  
**DATE : 07.10.2022**  
**SUBJECT : Supervised Learning**  
**AdaBoost-Gradient**  
**Boost - XGBoost**



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## MACHINE LEARNING - 5



Makine Öğrenmesi – 5



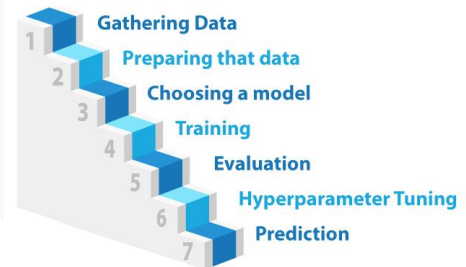
## Overall Table of Contents



### General Content

- ✓ Supervised Learning Algorithm – **Bagging – Boosting Methods**
- ✓ Supervised Algorithm practices Python application
- ✓ Projects Solutions

### 7 steps of Machine Learning

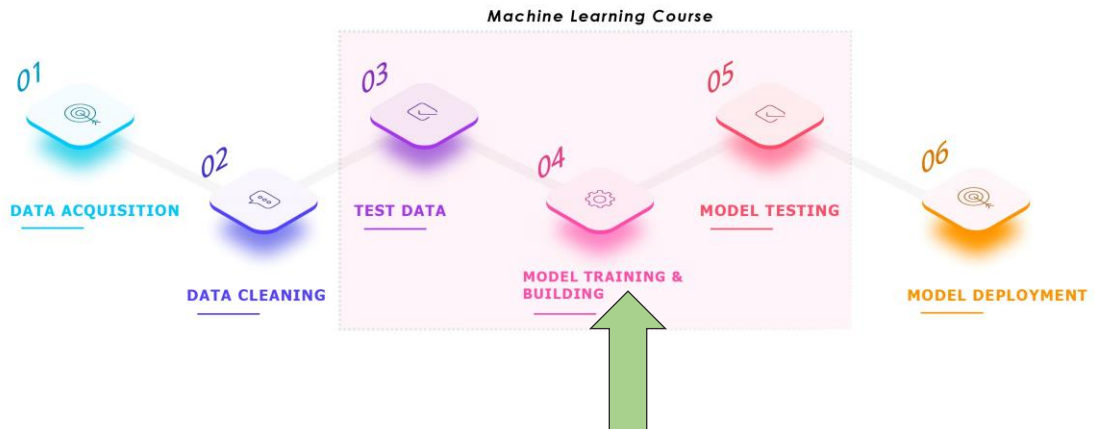


## ENSEMBLE LEARNING

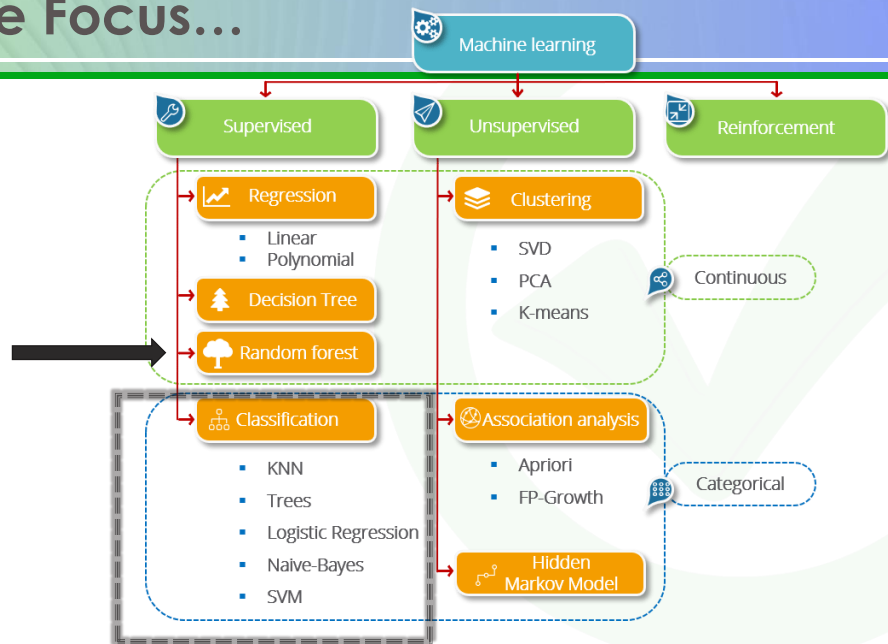


## Where are we?

DATA SCIENCE

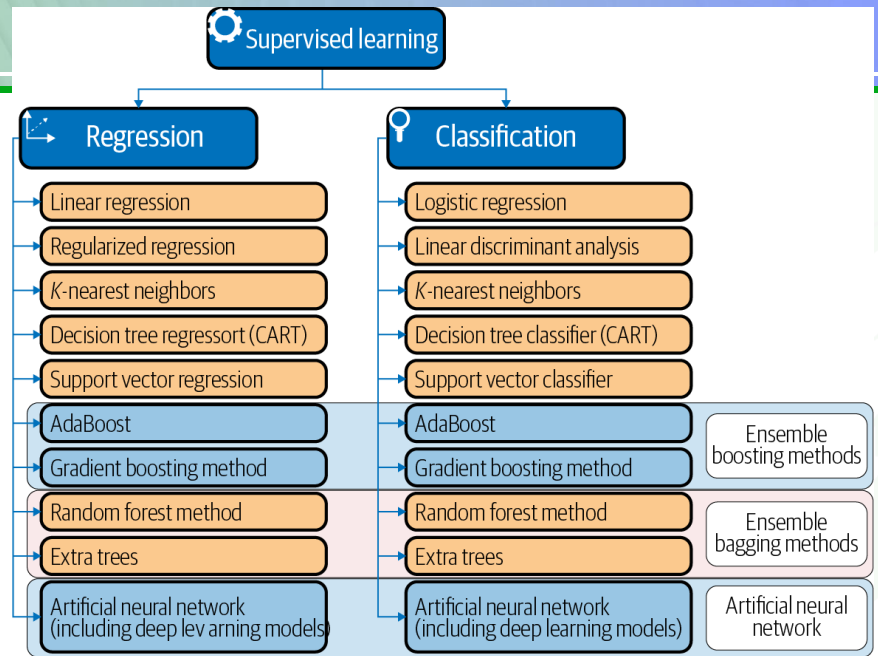


## More Focus...





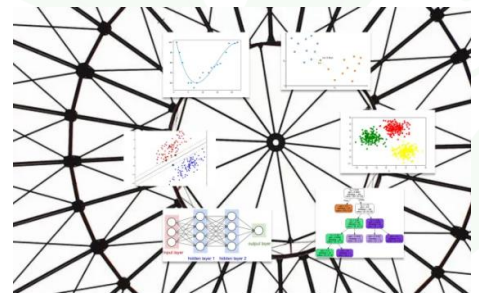
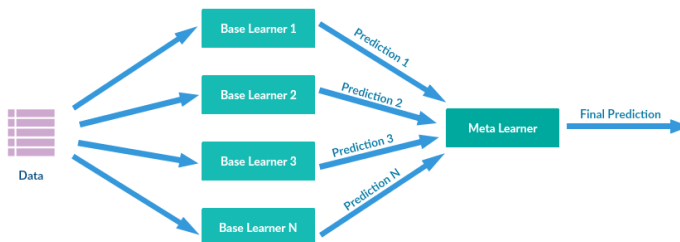
More..



## Supervised Learning

### ENSEMBLE LEARNING METHODS (Kolektif Öğrenme Metotları)

- ✓ Farklı makine öğrenmesi algoritmalarını daha iyi bir tahmin için birlikte kullanmak mümkün mü?



Ensemble methods combine several machine learning models to improve results

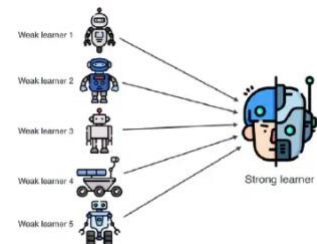


# Supervised Learning



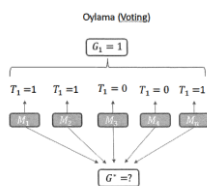
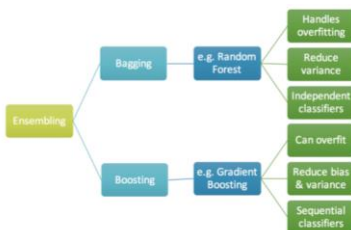
## Ensemble Learning

Özetle...

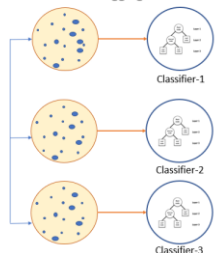


## Supervised L. - ENSEMBLE LEARNING METHODS

- ✓ Bagging (Bootstrap Aggregating)
- ✓ Boosting

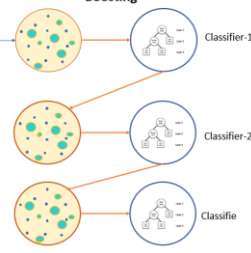


Bagging

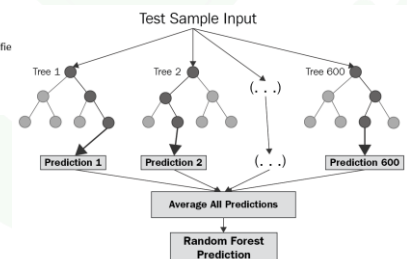


Parallel

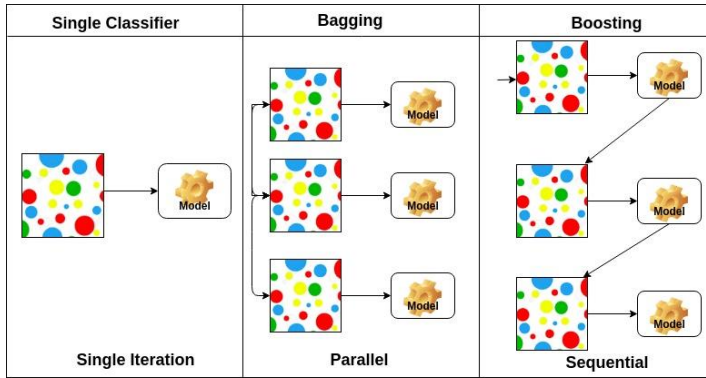
Boosting



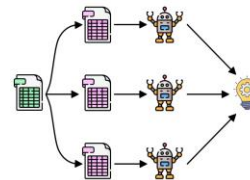
Sequential





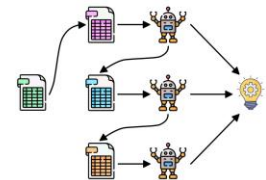


Bagging



Parallel

Boosting



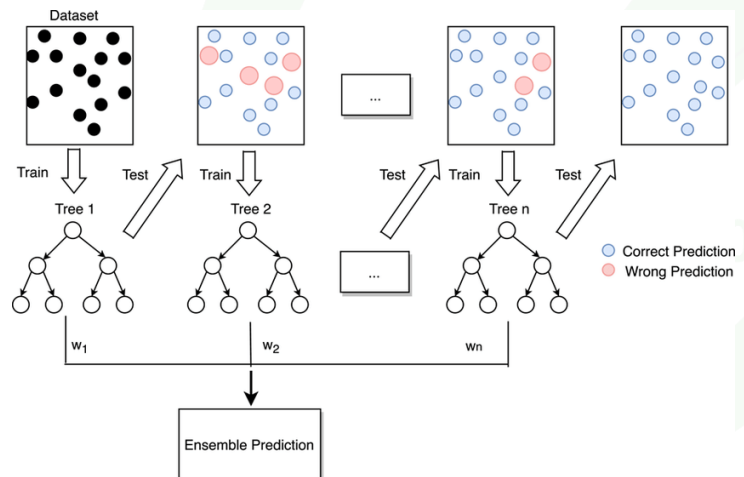
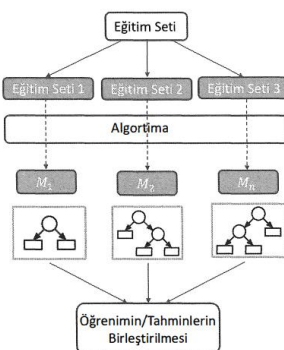
Sequential



## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Bagging (Random Forest-RF)

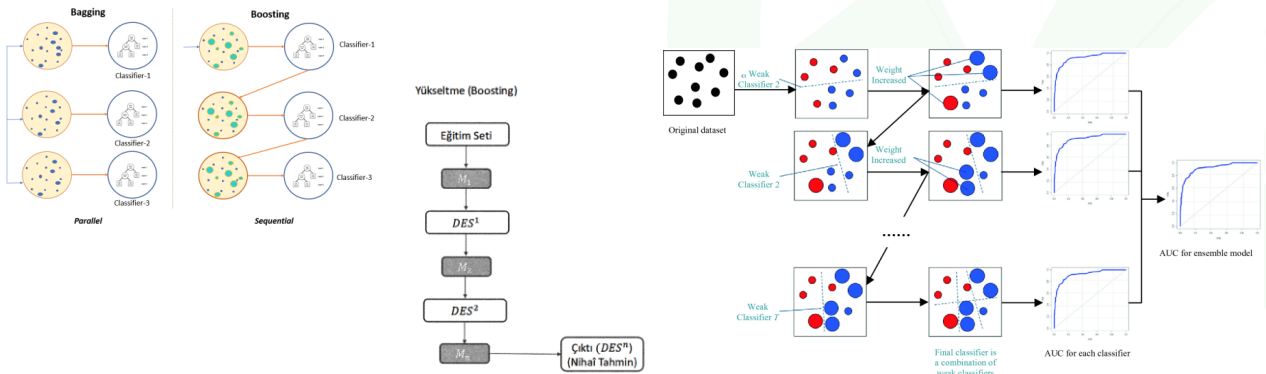
Çantalama (Bagging)





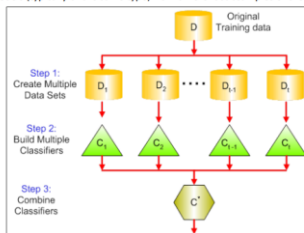
# Supervised L. - ENSEMBLE LEARNING METHODS

- ✓ Bagging
- ✓ Boosting (Ada Boost-Gradient Boost-XGBoost)



## Bagging

building multiple models (typically of the same type) from different subsamples of the training dataset.



	Bagging	Boosting
<b>Similarities</b>	<ul style="list-style-type: none"> <li>Uses voting</li> <li>Combines models of the same type</li> </ul>	
<b>Differences</b>	Individual models are built separately	Each new model is influenced by the performance of those built previously
	Equal weight is given to all models	Weights a model's contribution by its performance

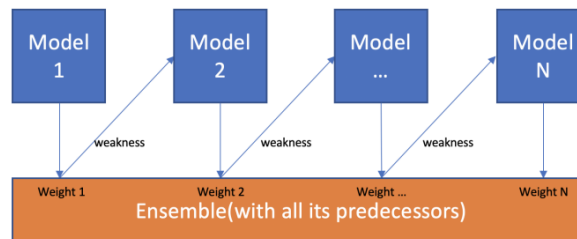
➡ BOOSTING --> AdaBoost

➡ BAGGING --> R F

## Boosting

Building multiple models (typically of the same type) each of which learns to fix the prediction errors of a prior model in the chain.

Model 1,2,..., N are individual models (e.g. decision tree)

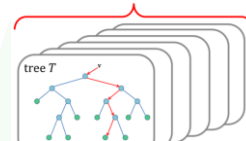
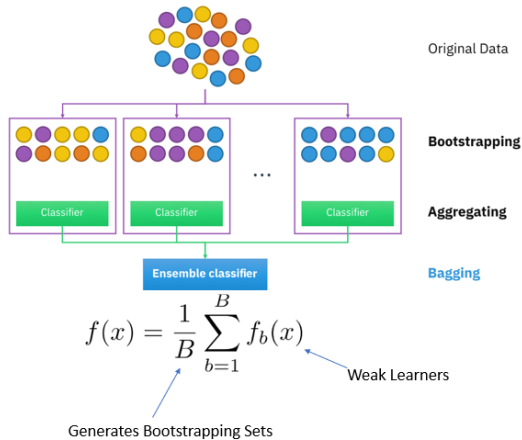




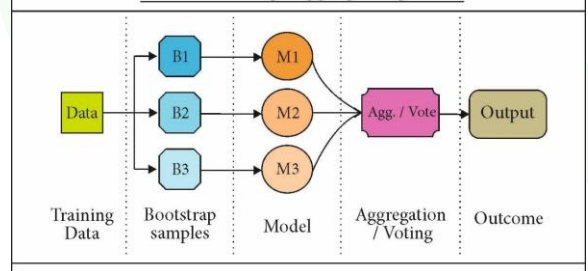
## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Bagging (Bootstrap Aggregating)

BAGGING LEARNING PROCEDURE

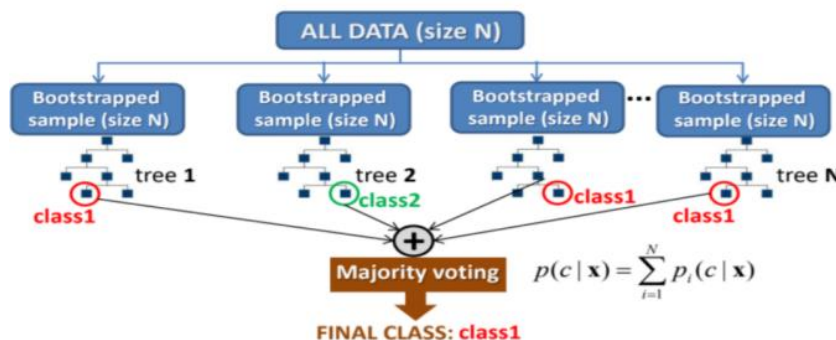


### BAGGING Algorithm Bootstrap Aggregating



## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Random Forest (RF)



#### Hyperparameters:

"n\_estimators" parameter: (default=100)

The number of trees in the forest.

The more # of trees, the better accuracy. But CPU intensive.

"max\_depth" parameter: (default=None)

The maximum depth of the tree.

If None, then nodes are expanded until all leaves are pure.

"max\_features" parameter:

Number of features to consider when looking for the best split.

Increase will improve the performance but results in a correlation between the trees.

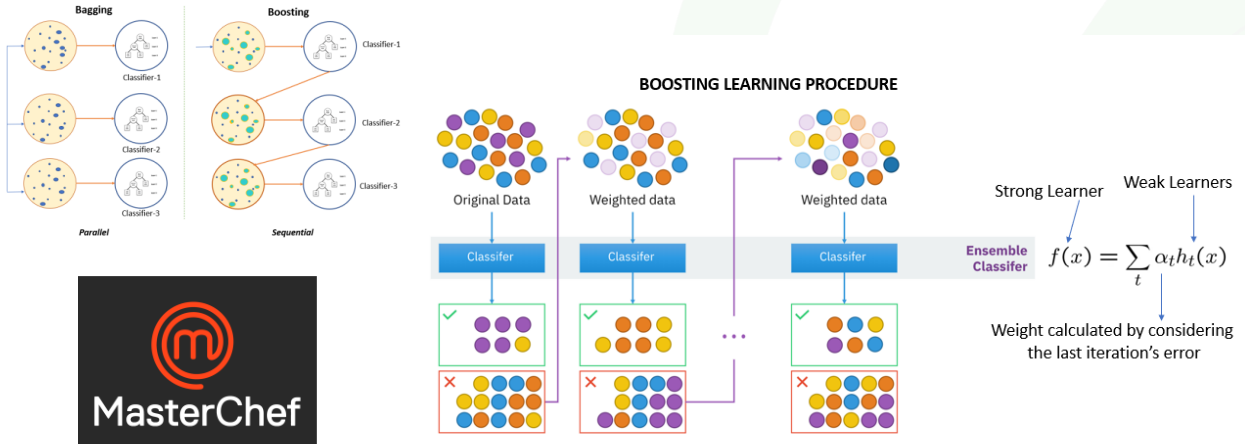
Avantaj -  
Dezavantajları





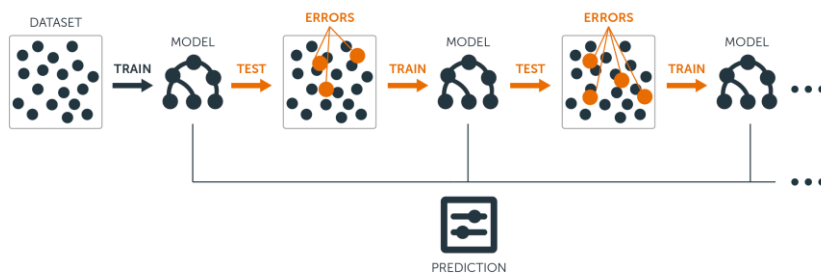
## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Boosting



## Supervised L. - ENSEMBLE LEARNING METHODS

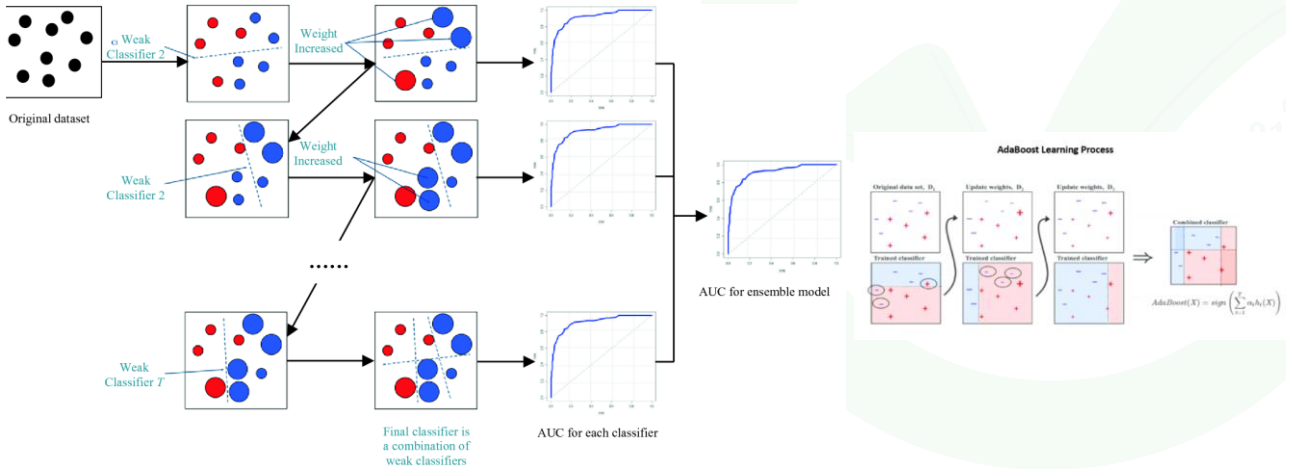
### ✓ Boosting (Yükseltme)





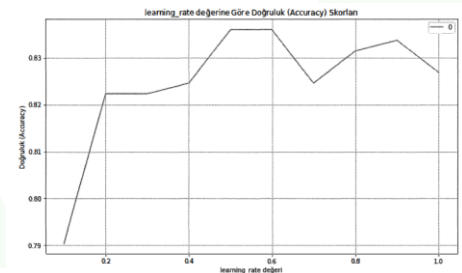
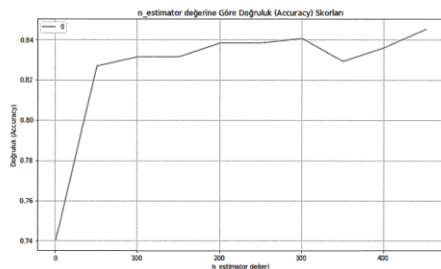
## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Ada Boosting (Adaptive Boosting)



## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ Ada Boosting (Adaptive Boosting)



```
188 # Varyans sorunu var mı?
189 from sklearn import metrics
190 # Modelin eğitim seti için doğruluk oranı:
191 print('Accuracy:%0.3f'%metrics.accuracy_score(y_train, y_pred_train))
192 # Modelin test seti için doğruluk oranı:
193 print('Accuracy:%0.3f'%metrics.accuracy_score(y_test, y_pred_test))
194
```

Accuracy:0.863  
Accuracy:0.827

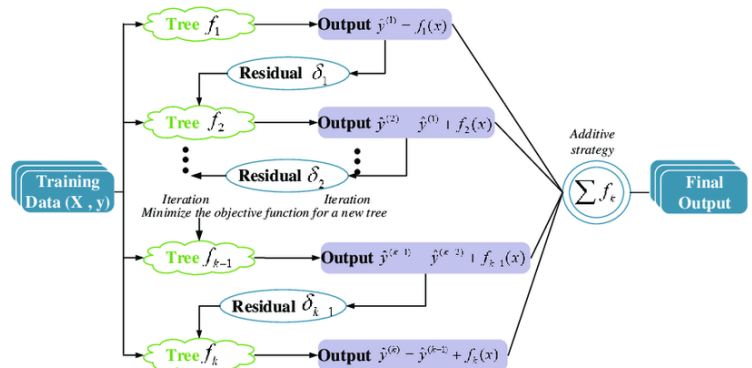
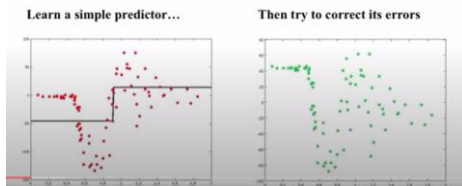


# Supervised L. - ENSEMBLE LEARNING METHODS

## ✓ Gradient Boosting

### Gradient Boosting

- Learn a regression predictor
- Compute the error residual
- Learn to predict the residual



<https://youtu.be/3zEqUSf5duw>

$$\text{Average Price!} + \text{Learning Rate} \times \text{Residual predicted by decision tree}$$

688 + 0.1 × -338



# Supervised L. - ENSEMBLE LEARNING METHODS

## ✓ Gradient Boosting

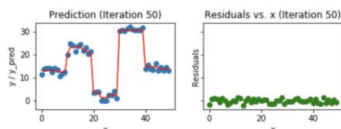
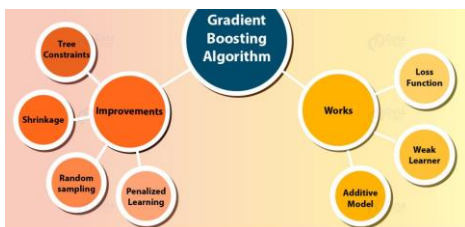


Fig 7. Visualization of gradient boosting prediction (iteration 50th)

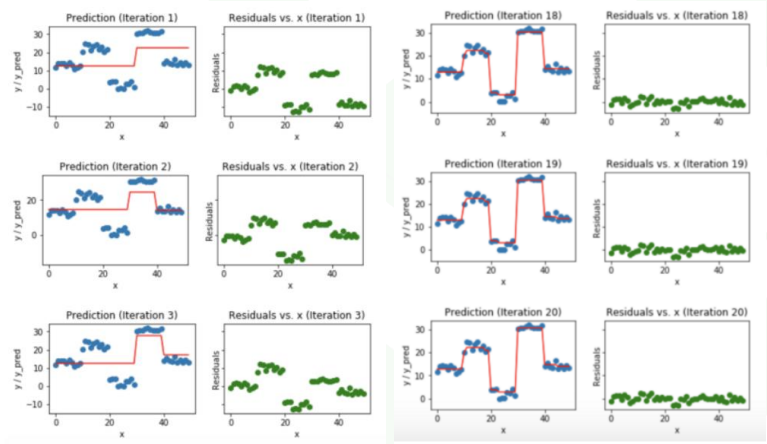


Fig 5. Visualization of gradient boosting predictions (first 4 iterations)

Fig 6. Visualization of gradient boosting predictions (18th to 20th iterations)

<https://blog.mlreview.com/gradient-boosting-from-scratch-1e317ae4587d>



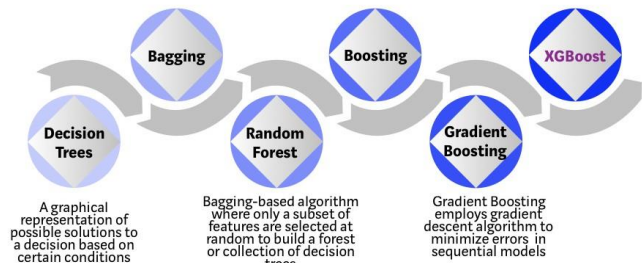
## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ XG Boost (EXtreme Gradient Boosting)

Bootstrap aggregating or Bagging is an ensemble meta-algorithm combining predictions from multiple decision trees through a majority voting mechanism

Models are built sequentially by minimizing the errors from previous models while increasing (or boosting) influence of high-performing models

Optimized Gradient Boosting algorithm through parallel processing, tree-pruning, handling missing values and regularization to avoid overfitting/bias



**"n\_estimators" parameter: (default=100)**

The number of boosting stages to perform.

**"max\_depth" parameter: (default=6)**

Max. depth of the individual estimators. This parameter limits the number of nodes in the tree.

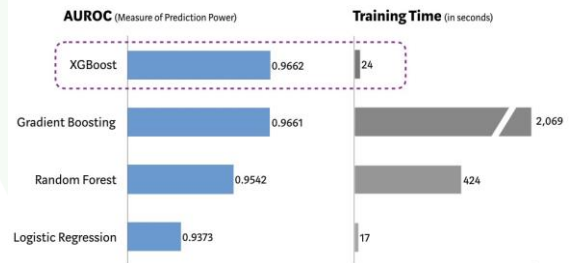
**"subsample" parameter: (default=1.0)**

The fraction of samples to be used for fitting the individual base learners. Choosing subsample < 1.0 leads to a reduction of variance and an increase in bias

**"learning\_rate" parameter: (default=0.3)**

Learning rate shrinks the contribution of each tree by learning\_rate. There is a trade-off between learning\_rate and n\_estimators

**Performance Comparison using SKLearn's 'Make\_Classification' Dataset**  
(5 Fold Cross Validation, 1MM randomly generated data sample, 20 features)

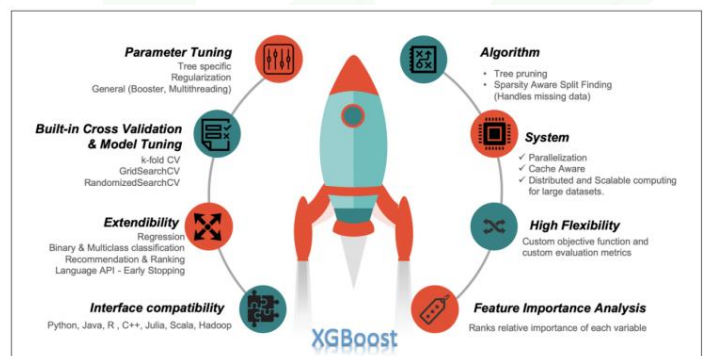


## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ XG Boost (EXtreme Gradient Boosting)

#### ✓ XGB neden diğerlerinden daha iyi?

- ✓ **Regularization**
- ✓ **Parallel Processing**
- ✓ **High Flexibility**
- ✓ **Handling Missing Values**
- ✓ **Tree Pruning**
- ✓ **Built-in Cross-Validation**



XGBoost Features



## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ ENSEMBLE KOLEKTİF ÖĞRENME YÖNTEMLERİ ARASINDAN MODEL SEÇİMİ

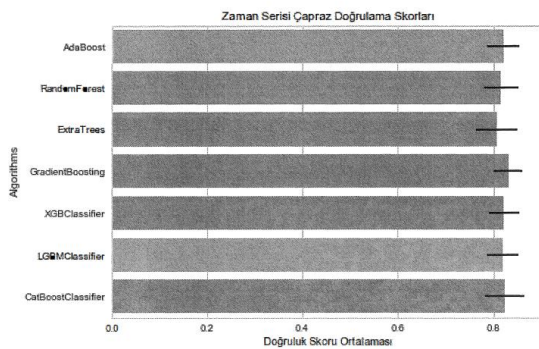
#### ✓ Zaman-performans ikilemi

- ✓ i) ortaya çıkacak performans bir tek algoritmanın ürettiği modelinkinden daha yüksek olmalı;
- ✓ ii) işlem süresi algoritmaların tek tek uygulanmasından daha kısa sürmeli.

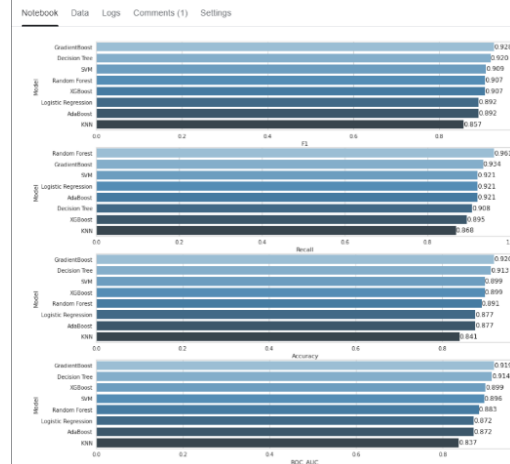


## Supervised L. - ENSEMBLE LEARNING METHODS

### ✓ XG BOOST (eXtram Gradient Boosting)



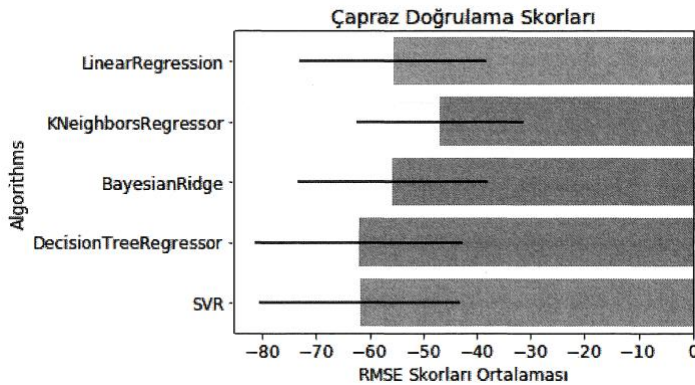
Heart\_Failure\_Predict\_8\_Classification\_Techniques





## Supervised L. - ENSEMBLE LEARNING METHODS

# REGRESYON OLARAK KULLANILABİLEN SINIFLANDIRMA ALGORİTMALARI



Eğitim Seti için RMSE:36.87  
Test Seti için RMSE:77.11

Eğitim Seti için R2:0.88  
Test Seti için R2:0.56

### ➤ Exploratory Data Analysis and Visualization

### ➤ Machine Learning

#### ❖ Train | Test Split

- `X_train, X_test, y_train, y_test = train_test_split()`

#### ❖ Scaling (if needed)

- `scaler = scaler_name()`
- `scaler.fit_transform(X_train)`
- `scaler.transform(X_test)`

#### ❖ Modelling

- `model = model_name().fit(X_train, y_train)`
- `y_pred = model.predict(X_test)`
- `y_pred_proba = model.predict_proba(X_test)`

#### ❖ Model Performance

- Regression => `r2_score`, `MAE`, `MSE`, `RMSE`
- Classification => `accuracy`, `recall`, `precision`, `f1_score` (`confusion_matrix`, `classification_report`)
- Cross Validate => `cross_val_score`, `cross_validate`

#### ❖ Tuning (if needed)

- `grid_param = {}`
- `GridsearchCV(grid_param)`

#### ❖ Final Model

- `model = model_name().fit(X, y)`

### ➤ Model Deployment

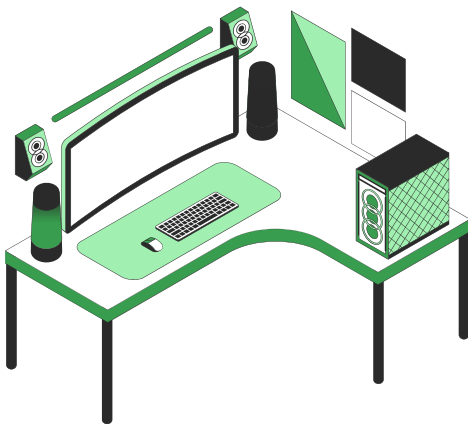




Bu dersi anladım..



Everything is  
clear ?



Do you  
have any  
questions?

Send it to us! We hope you learned  
something new.



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