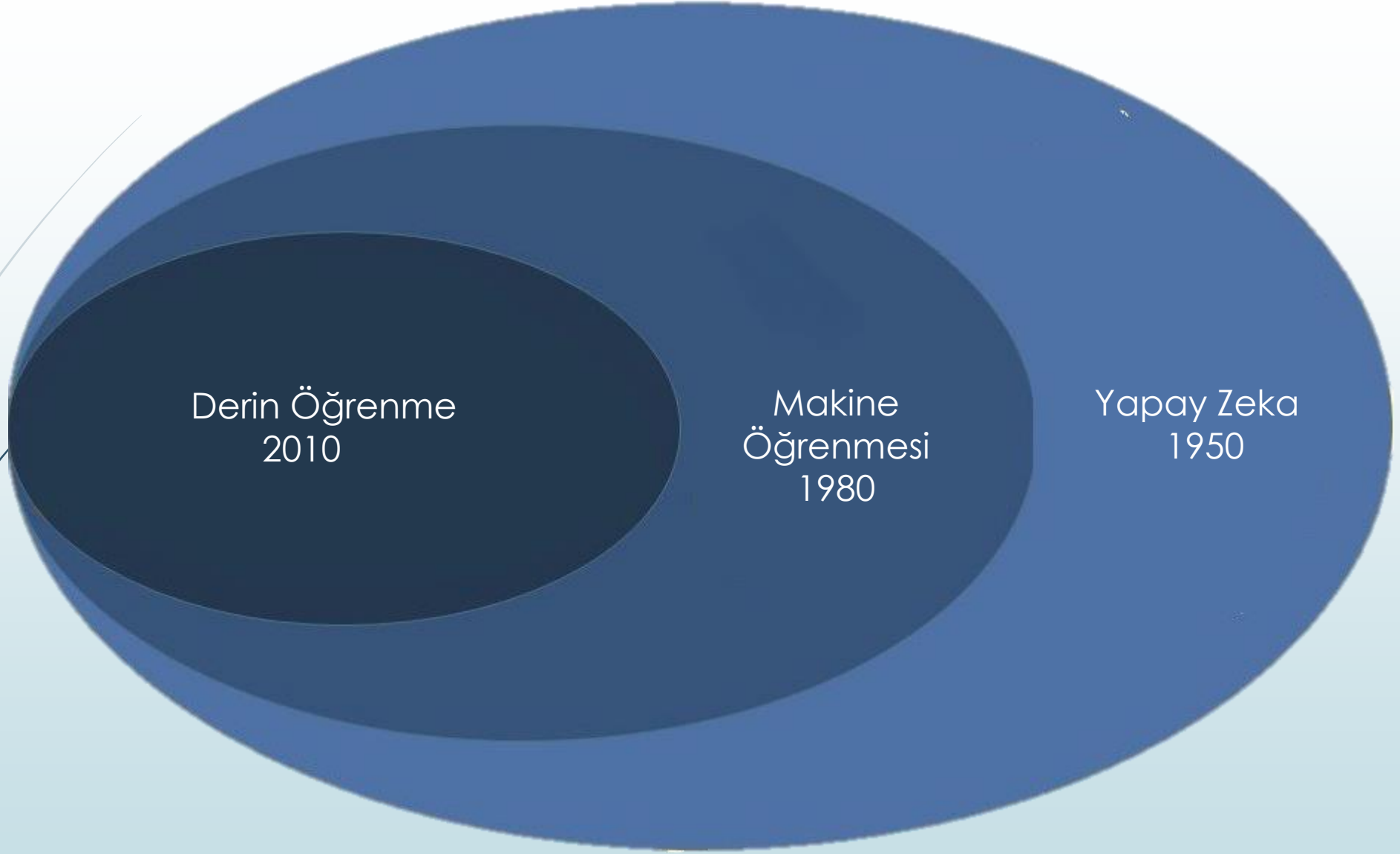
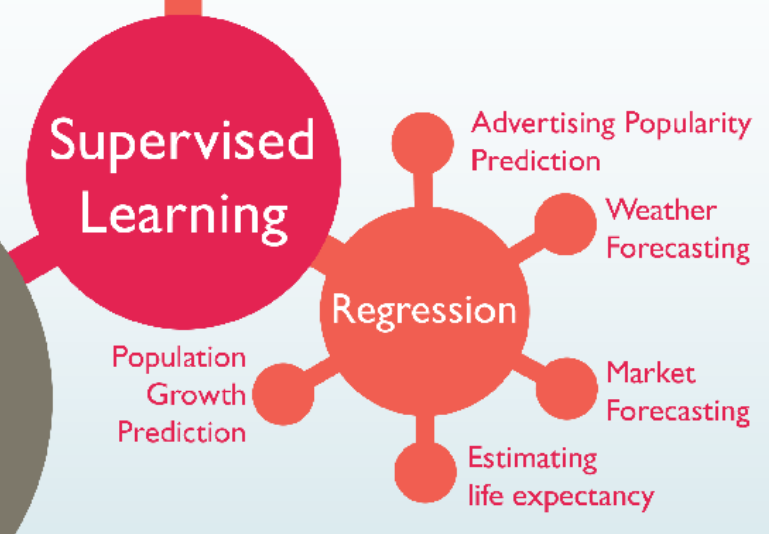
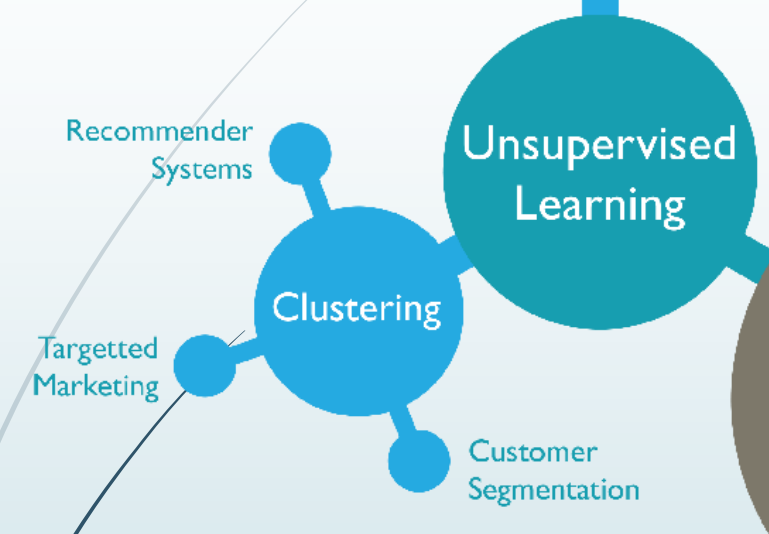
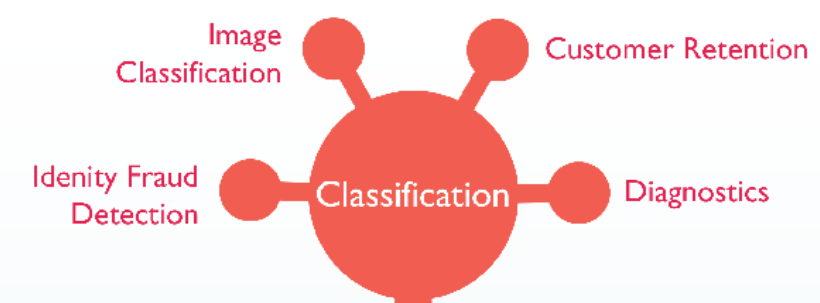


*Makine Öğrenmesi ve Yenilenebilir Enerji Uygulamaları  
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# Tarihsel Süreç

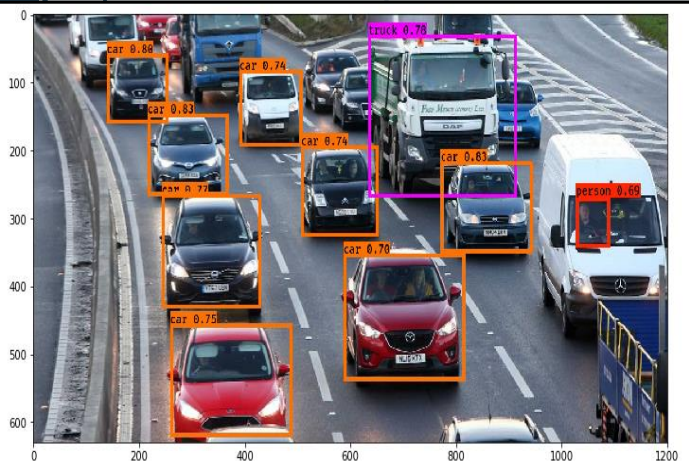




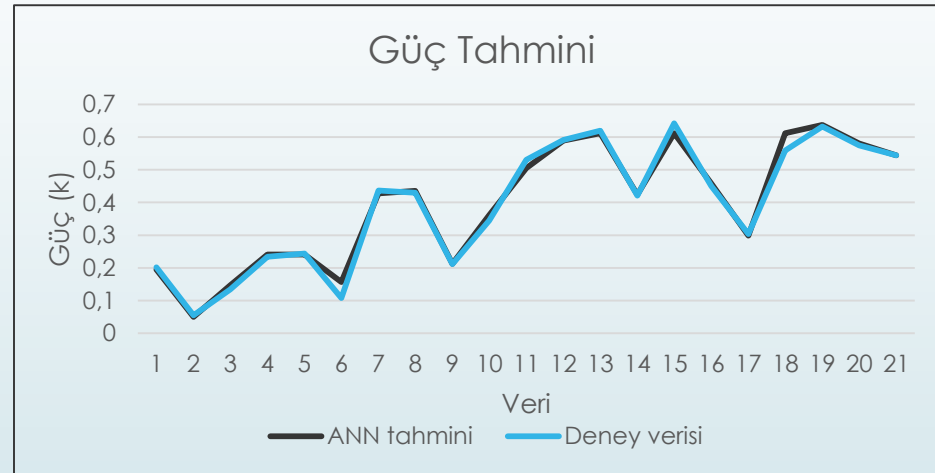
# Machine Learning



## Real-time decision



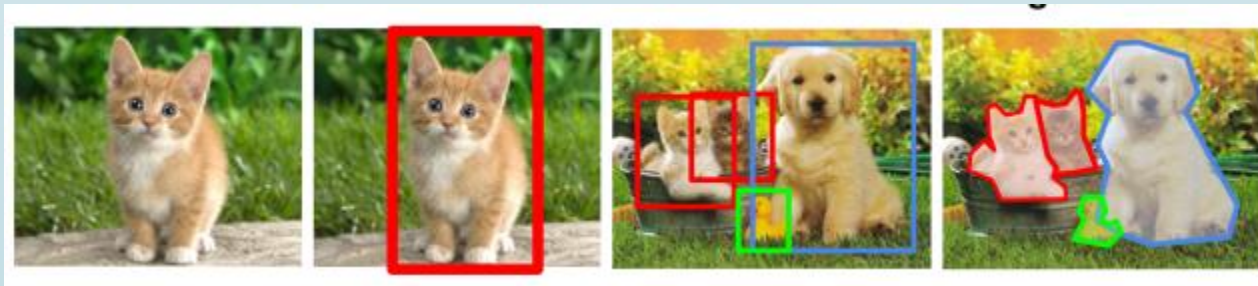
## Prediction

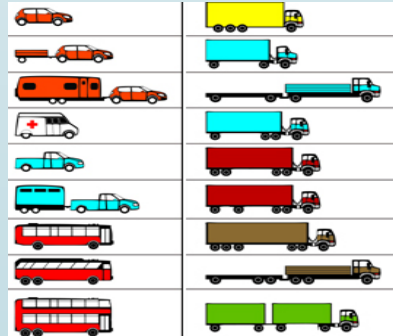
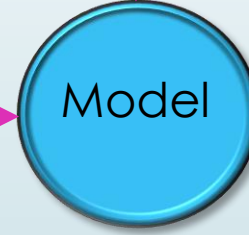
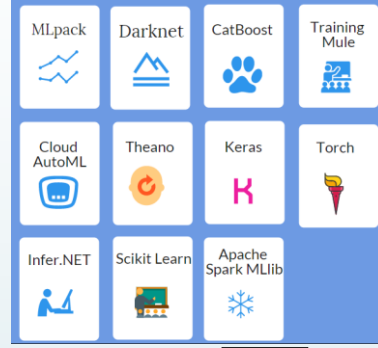


## Robot Navigation

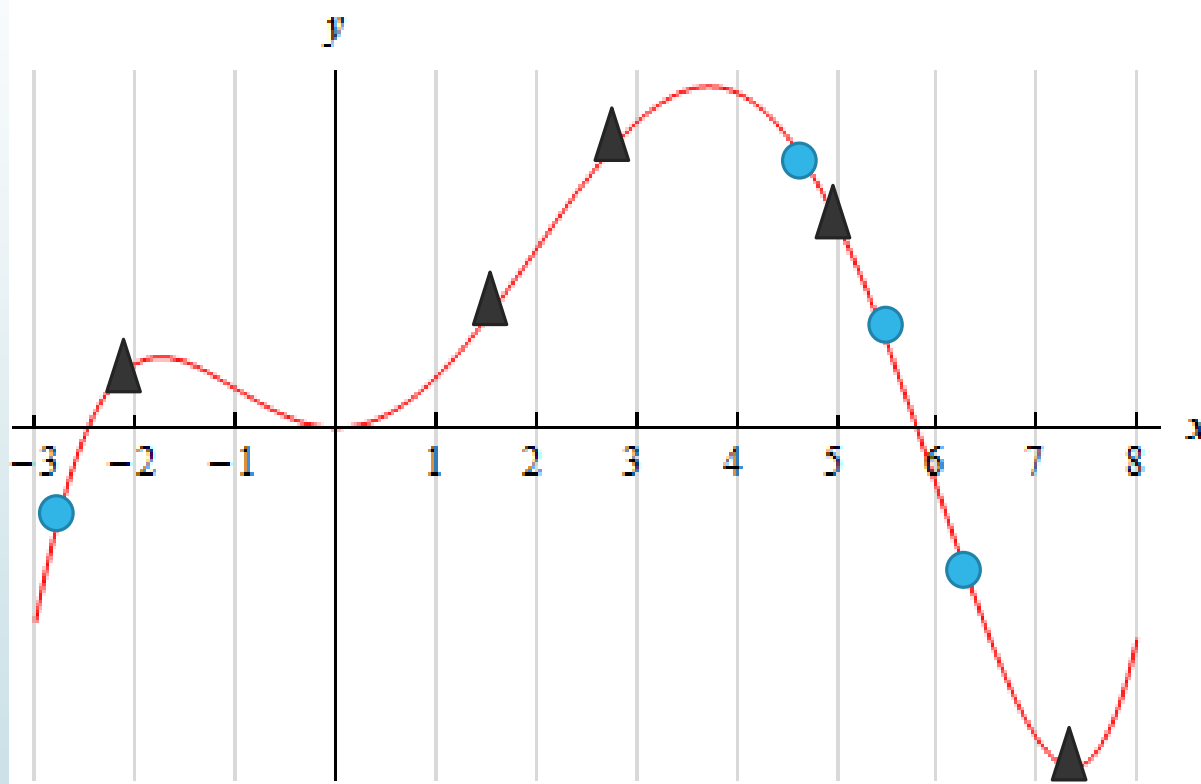


## Image Classification

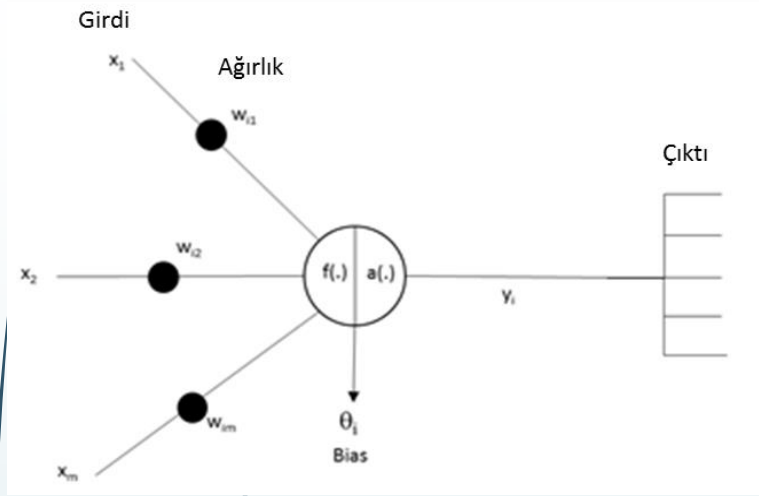




Mühendislik uygulamalarında amaç var olan veriler ışığında sistemin davranışını tespit veya tahmin etmek



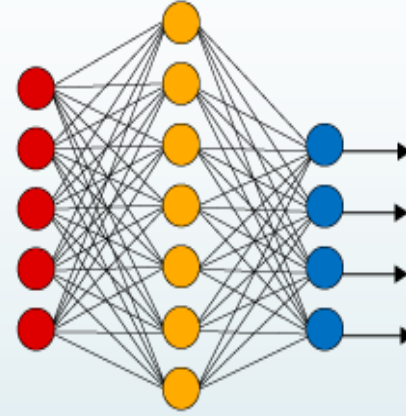
- Bilinen Veriler
- ▲ Bilinmeyenler



$$S_i = \sum_{i=1}^n w_{ij} x_i$$

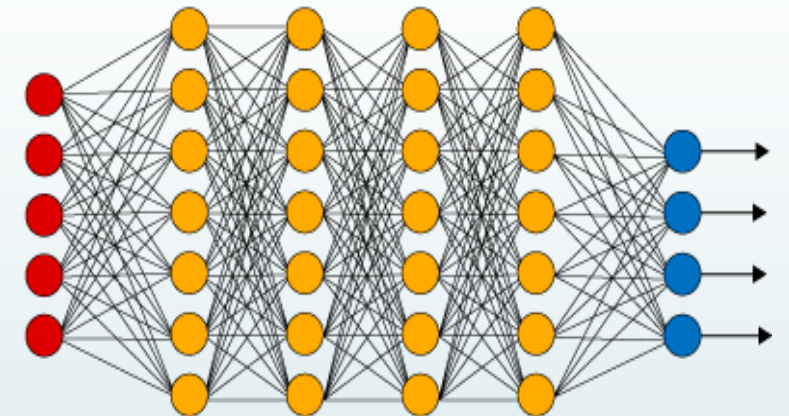
$x =$  Girdi  
 $w =$  Ağırlık (Etki)  
 $S =$  Çıktı

Simple Neural Network



● Input Layer

Deep Learning Neural Network

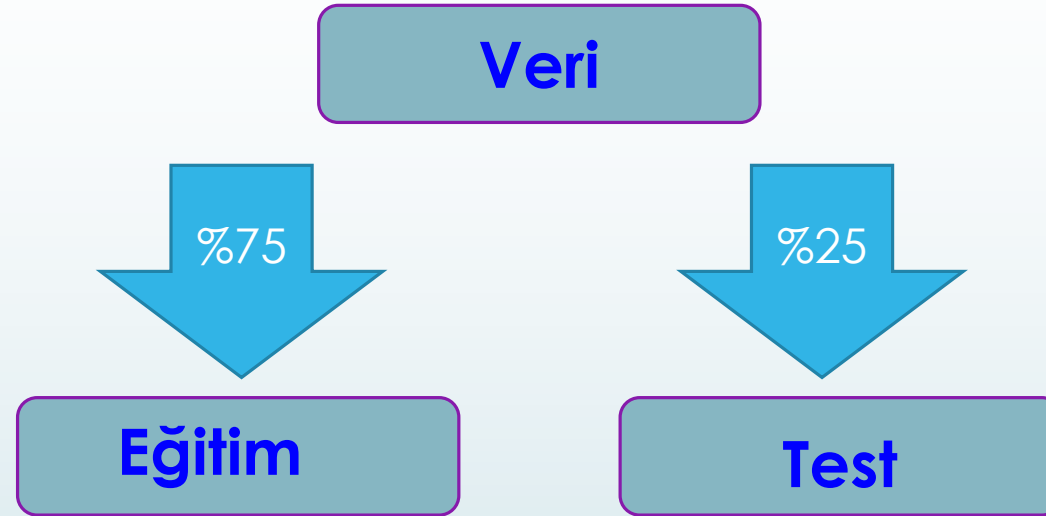


● Hidden Layer

● Output Layer

Nasıl Çalışır

# Hata Kriterleri



$$R^2 = 1 - \frac{\sum_i^N (X_{Gerçek,i} - X_{tahmin,i})^2}{\sum_i^N (X_{Gerçek,i})^2}$$

$$RMSE = \sqrt{\sum_{i=1}^N \frac{(X_{Gerçek,i} - X_{tahmin,i})^2}{N}}$$

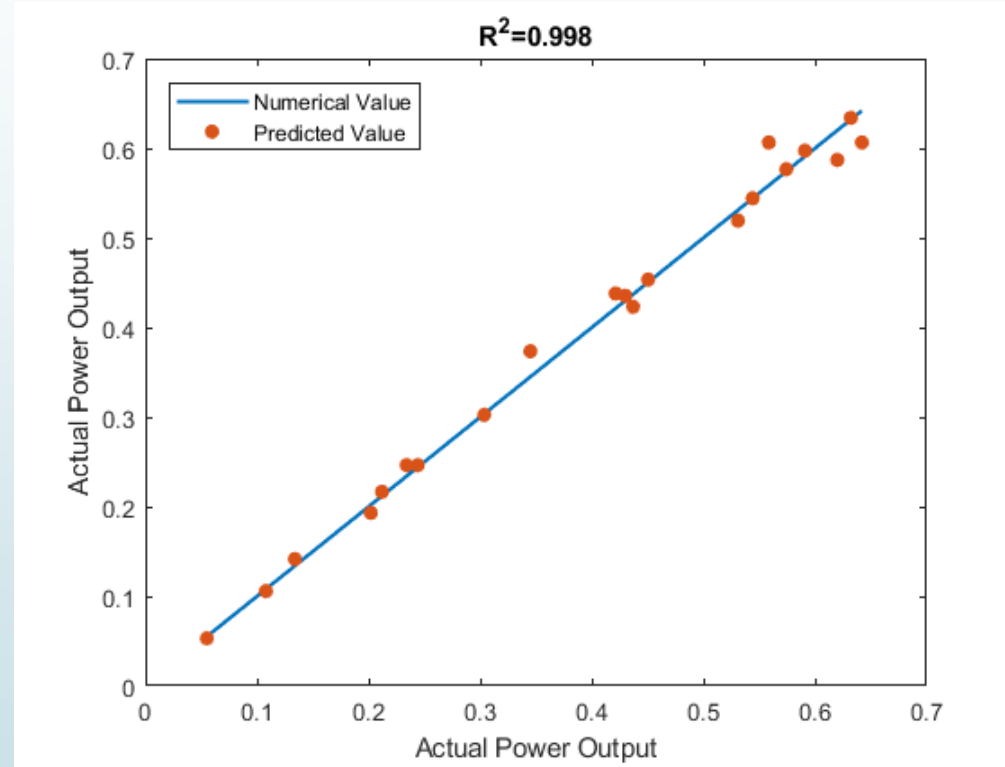
$$OKH = \frac{1}{N} \frac{|X_{Gerçek,i} - X_{tahmin,i}|}{|X_{Gerçek,i}|}$$



R-square: Girdilerin ortalamasına olan hataların toplamı

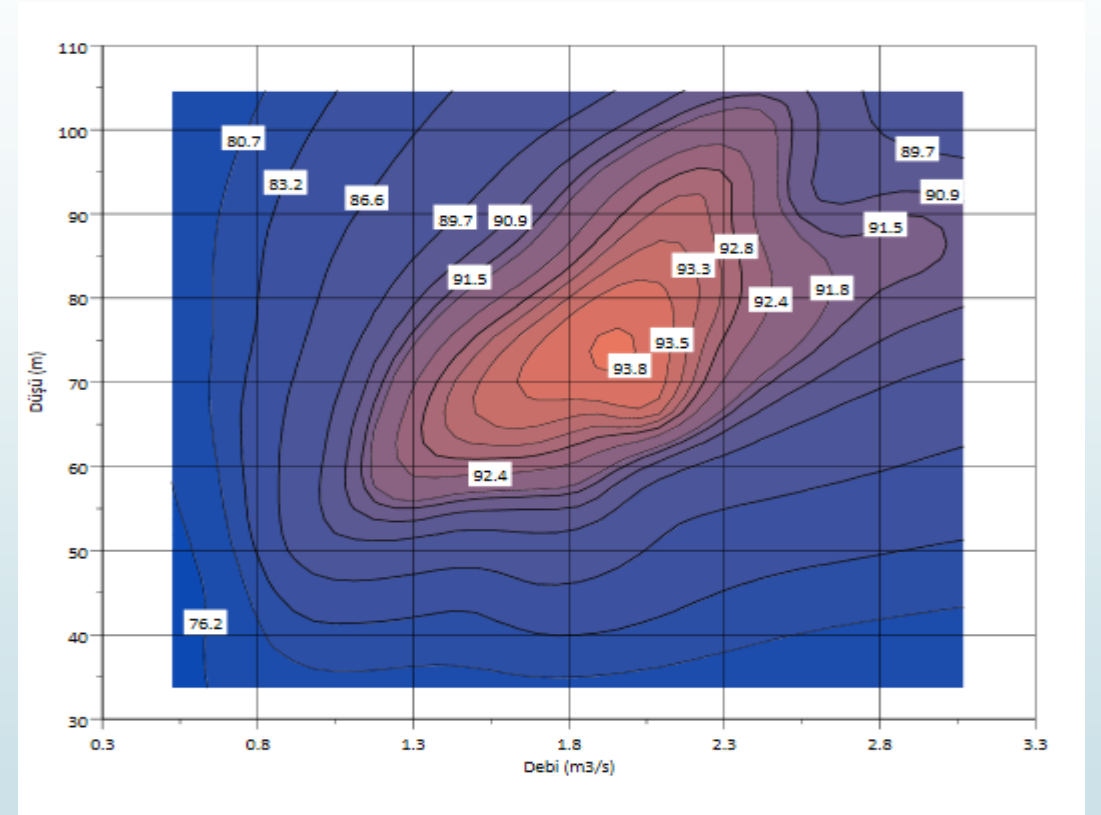
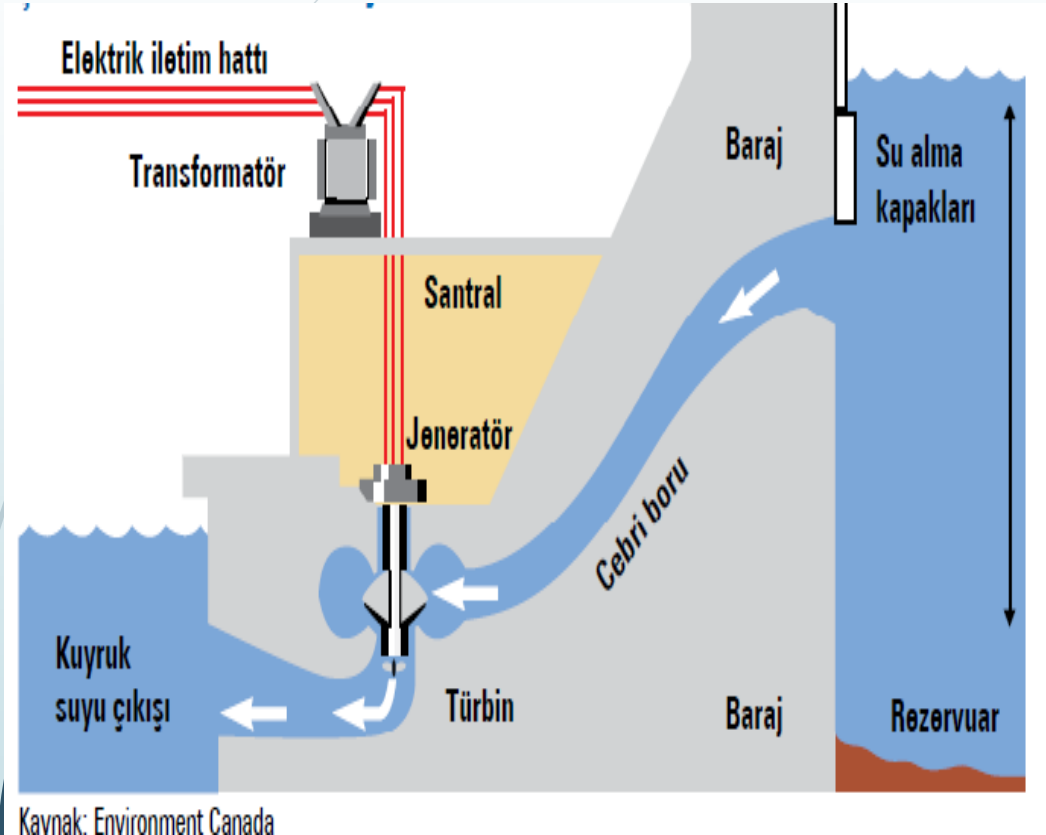
RMSE: Yapılan tahminin gerçek veriye olan uzaklığının ortalaması

OKH: Hataların ortalaması



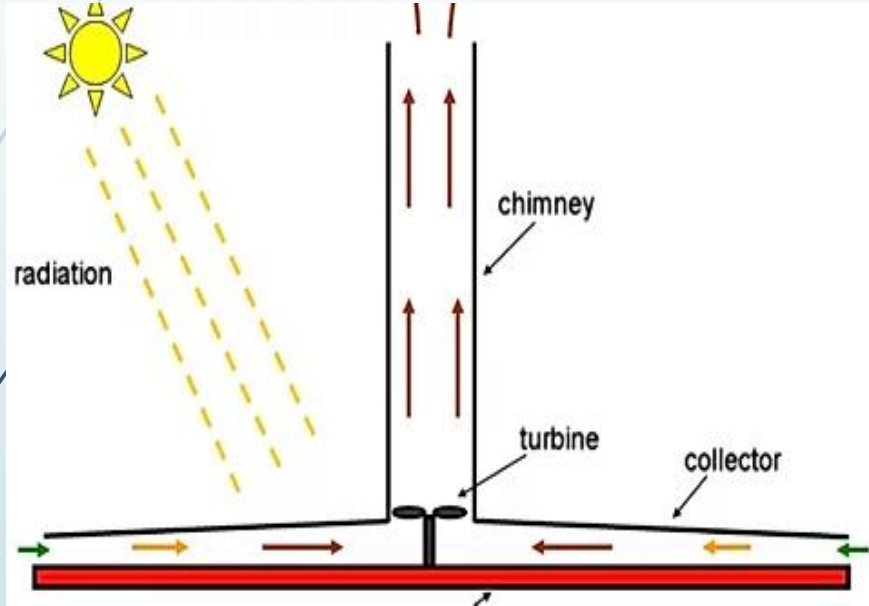
# Örnek: Buski HES

Girdiler = Debi, Düşü Çıktı= Verim

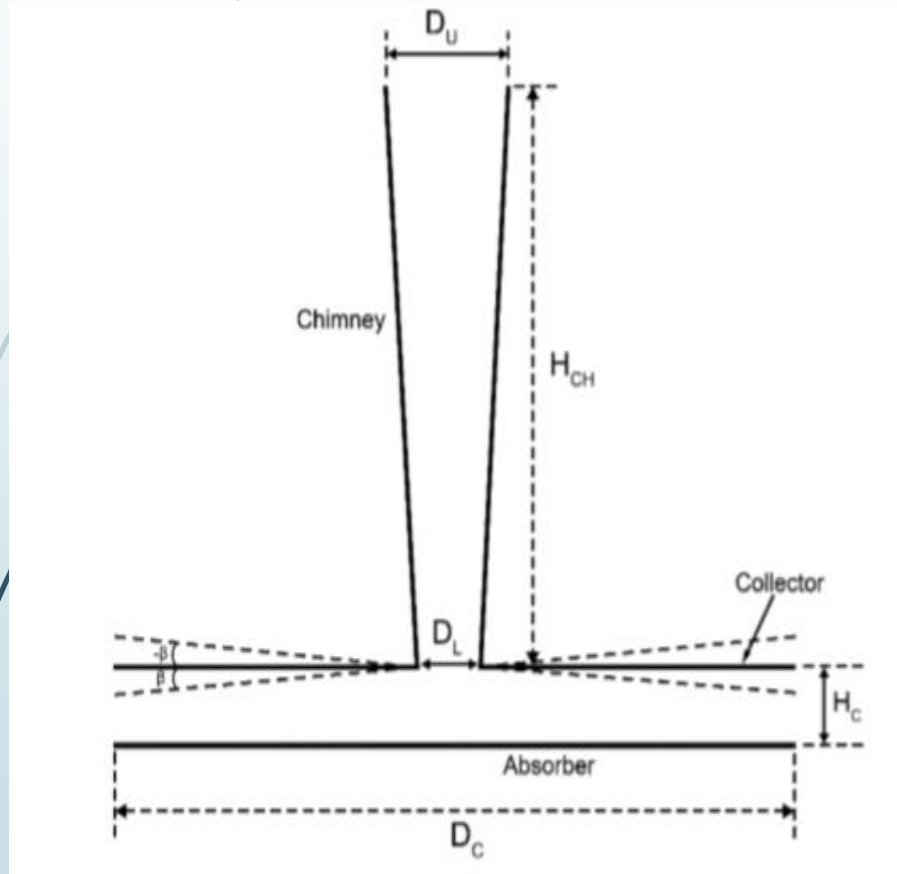


Ulucak, O., Ayli, E., ANN, and ANFIS Performance Prediction models for Francis type Turbines, Journal of Thermal Sciences and Technology, 2020

## Örnek: Geometri Optimizasyonu- Yapay Sinir ağıları Tasarımı

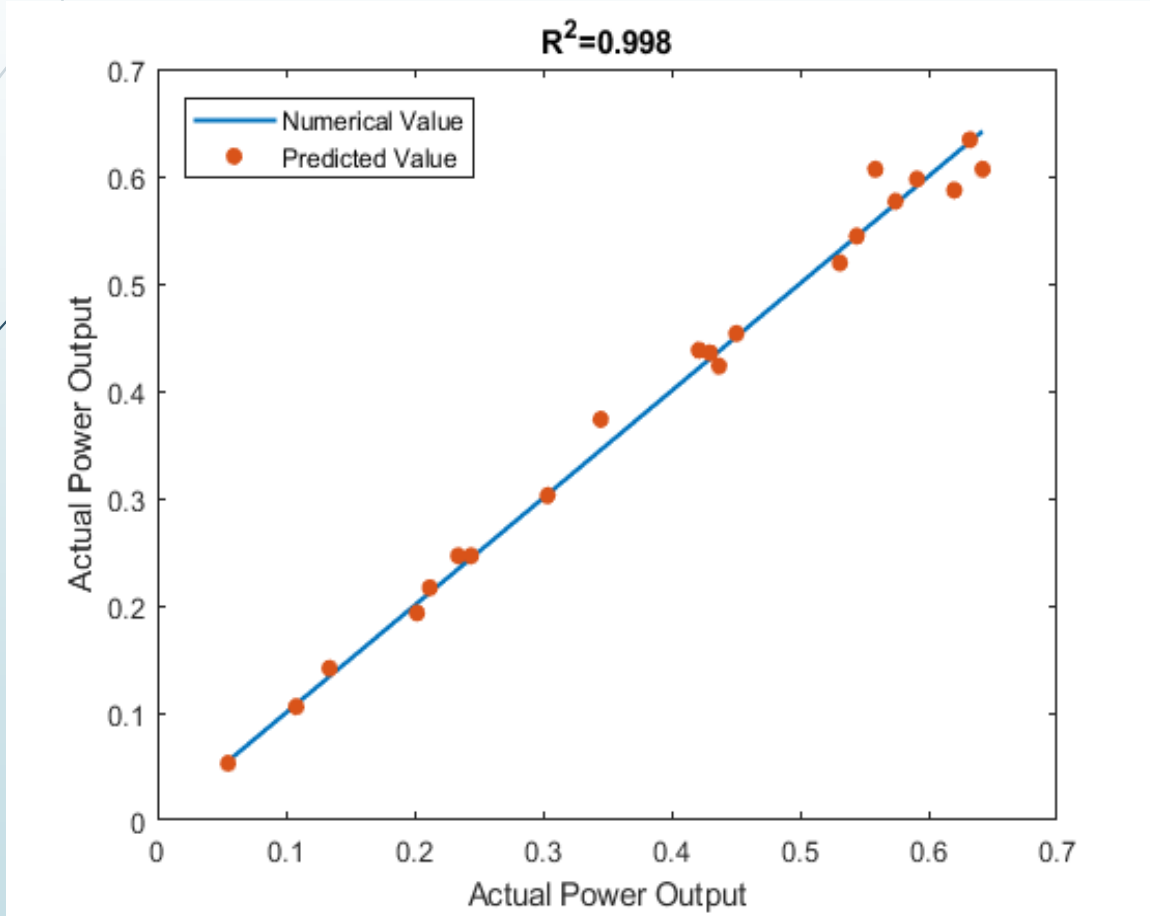


# Veri-Eğitim



CFD/ Girdiler	Girdi						Güç
	Chimney			Collector			
	Kule Yükseklği	Kule Girişi	Kule Çıkışı	Kollektör çapı	Kollektör genişliği	Meyil Açısı	
CFD 1	300	20	20	150	6	0	0.20
CFD 2	150	20	20	150	6	0	0.06
CFD 3	250	20	20	150	6	0	0.13
CFD 4	350	20	20	150	6	0	0.23
CFD 5	350	20	20	150	6	0	0.24
CFD 6	350	15	15	150	6	0	0.11
CFD 7	350	25	25	150	6	0	0.44
CFD 8	350	35	35	150	6	0	0.43
CFD 9	350	25	35	100	6	0	0.21
CFD 10	350	25	35	125	6	0	0.35
CFD 11	350	25	35	150	6	0	0.53
CFD 12	350	25	35	175	6	0	0.59
CFD 13	350	25	35	200	5	0	0.62
CFD 14	350	25	35	200	4	0	0.42
CFD 15	350	25	35	200	6	0	0.64
CFD 16	350	25	35	200	8	0	0.45
CFD 17	350	25	35	200	10	0	0.30
CFD 18	350	25	35	200	6	0	0.56
CFD 19	350	25	35	200	6	0.5	0.63
CFD 20	350	25	35	200	6	-0.5	0.57
CFD 21	350	25	35	200	6	-1	0.54

# Eđitim dođrulaması



Güç(p1,p2,p3,p4, p5, p6)=Tanımlı

# Optimizasyon Metodu

P1						121 x 6 matrix
1. Girdi	2. Girdi (Ortalama)	3. Girdi (Ortalama)	4. Girdi (Ortalama)	5. Girdi (Ortalama)	6. Girdi (Ortalama)	
500	Sabit	Sabit	Sabit	Sabit	Sabit	
503	Sabit	Sabit	Sabit	Sabit	Sabit	
506	Sabit	Sabit	Sabit	Sabit	Sabit	
...	...	...	...	...	...	
...	...	...	...	...	...	
4997	Sabit	Sabit	Sabit	Sabit	Sabit	
4500	Sabit	Sabit	Sabit	Sabit	Sabit	

$P_{1, \text{Optimum}} = \text{Power Maximum } (P_{2, \text{Ortalama}}, P_{3, \text{Ortalama}}, P_{4, \text{Ortalama}}, P_{5, \text{Ortalama}}, P_{6, \text{Ortalama}})$

$P_{2, \text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{3, \text{Ortalama}}, P_{4, \text{Ortalama}}, P_{5, \text{Ortalama}}, P_{6, \text{Ortalama}})$

$P_{3, \text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{2, \text{optimum}}, P_{4, \text{Ortalama}}, P_{5, \text{Ortalama}}, P_{6, \text{Ortalama}})$

$P_{4, \text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{2, \text{optimum}}, P_{3, \text{optimum}}, P_{5, \text{Ortalama}}, P_{6, \text{Ortalama}})$

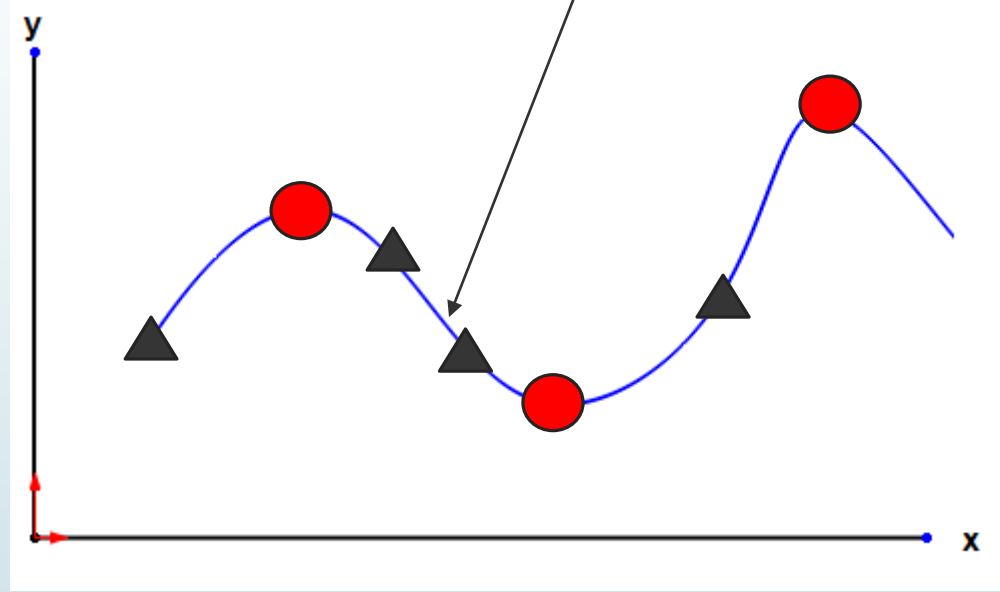
$P_{5, \text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{2, \text{optimum}}, P_{3, \text{optimum}}, P_{4, \text{optimum}}, P_{6, \text{Ortalama}})$

$P_{6, \text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{2, \text{optimum}}, P_{3, \text{optimum}}, P_{4, \text{optimum}}, P_{5, \text{optimum}})$

$P_{\text{Optimum}} = \text{Power Maximum } (P_{1, \text{optimum}}, P_{2, \text{optimum}}, P_{3, \text{optimum}}, P_{4, \text{optimum}}, P_{5, \text{optimum}}, P_{6, \text{optimum}})$

Sistemin Çıkışı

Sistemin Davranışı  
(Ör: Güç)

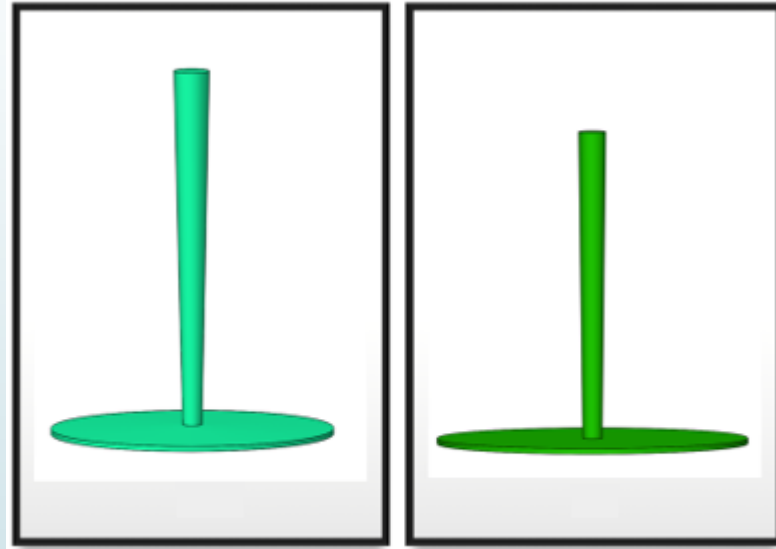


- ▲ Bilinen Noktalar  
(Deney,  
Fonksiyon)
- Yakalanmak  
istenen  
Maksimum değer

Sistemin Parametresi

721 Adet Farklı Tasarım içinden seçilen optimum geometri

+ %14.1 Güç



ANN model

CFD model



- Image Processing
- Edge Detection
- Big Data
- Web Scrapping
- Data Mining
- Genetic Algorithm

