

Makine Öğrenmesi Nedir?

Karmaşık Sistemler ve Veri Bilimi Çalıştayı

@Boğaziçi Üniversitesi

04.05.2019



Ben Kimim?

Metin USLU

İş

- Veri Bilimci @ LC Waikiki - 02.2019
- Büyük Veri Analisti | Bilgi Teknolojileri ve İletişim Kurumu (BTK) - 01.2017 - 02.2019
- Yönetim Bilişim Sistemleri Uzm Yrd. | Kuveyt Türk Katılım Bankası - 10.2015 - 01.2017
- ...

Eğitim

İstanbul Üniversitesi | Bilgisayar Programlama
Hacettepe Üniversitesi | İstatistik
Konya NEU | Bilgisayar Mühendisliği (Öğrenci)

İletişim



@metinuslu - uslumetin@gmail.com

Sunum Planı

1. LC Waikiki'de Neler Yapıyoruz?
2. Büyük Veri ve Yapay Zeka Laboratuvarı: BTK BAB
3. Makine Öğrenmesi Nedir?

LC Waikiki | Mağaza İçi Analitik (In Store Analytics)



Kaynak: https://www.necdisplay.com/images/whitepapers/Facial_Recognition_Retail_Benefits.jpg

Mağaza Müşterilerinin

Üzerinde Çalıştıklarımız

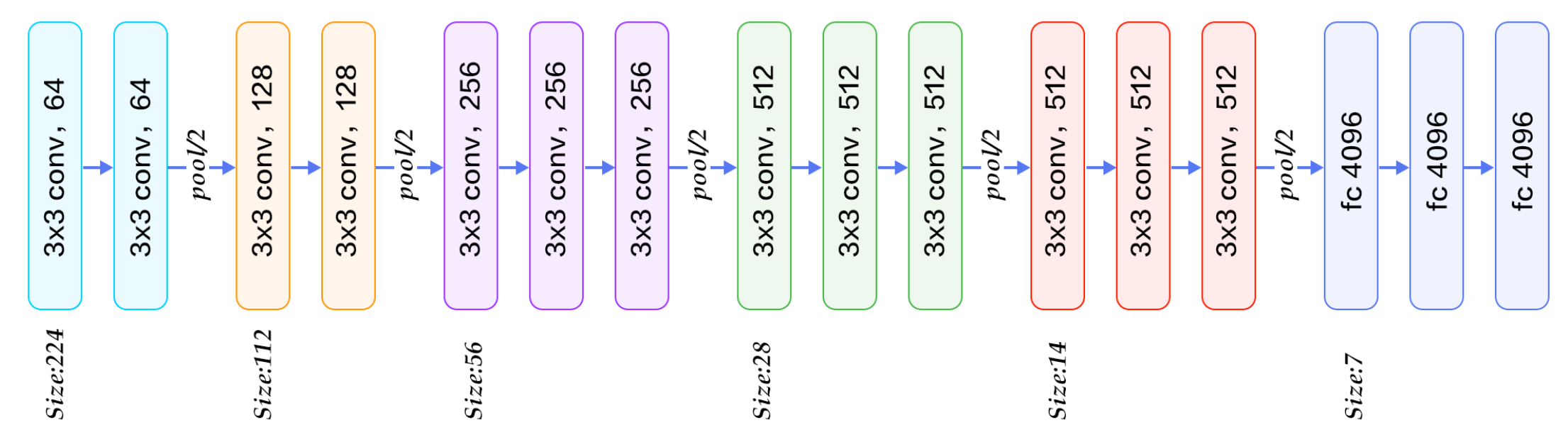
- ❖ Cinsiyet - VGG-16 - Acc.: %96
- ❖ Yaş (Görünen) - VGG-16 - MAE: ± 4.65
- ❖ Boy Uzunluğu - Object Detection ve Pose Estimation

Neler Yapmak İstiyoruz?

- ❖ Emotion
- ❖ Persona (Profil, Eğilim)

LC Waikiki | Mağaza İçi Analitik (In Store Analytics)

VGG-16



Kaynak: <https://www.quora.com/What-is-the-VGG-neural-network>

BTK BAB | Büyük Veri ve Yapay Zeka Lab.



Kaynak: bab.btk.gov.tr

BTK BAB | Büyük Veri ve Yapay Zeka Lab.

Yazılım Bileşenleri:

- Vertica
- GreenPlum
- Hadoop Ekosistemi
- Apache Spark
- PostgreSQL
- Elasticsearch
- Cassandra
- Mongo
- Neo4J
- Python
- Weka
- R & R Studio Server
- Knime
- ...

Donanım Bileşenleri:

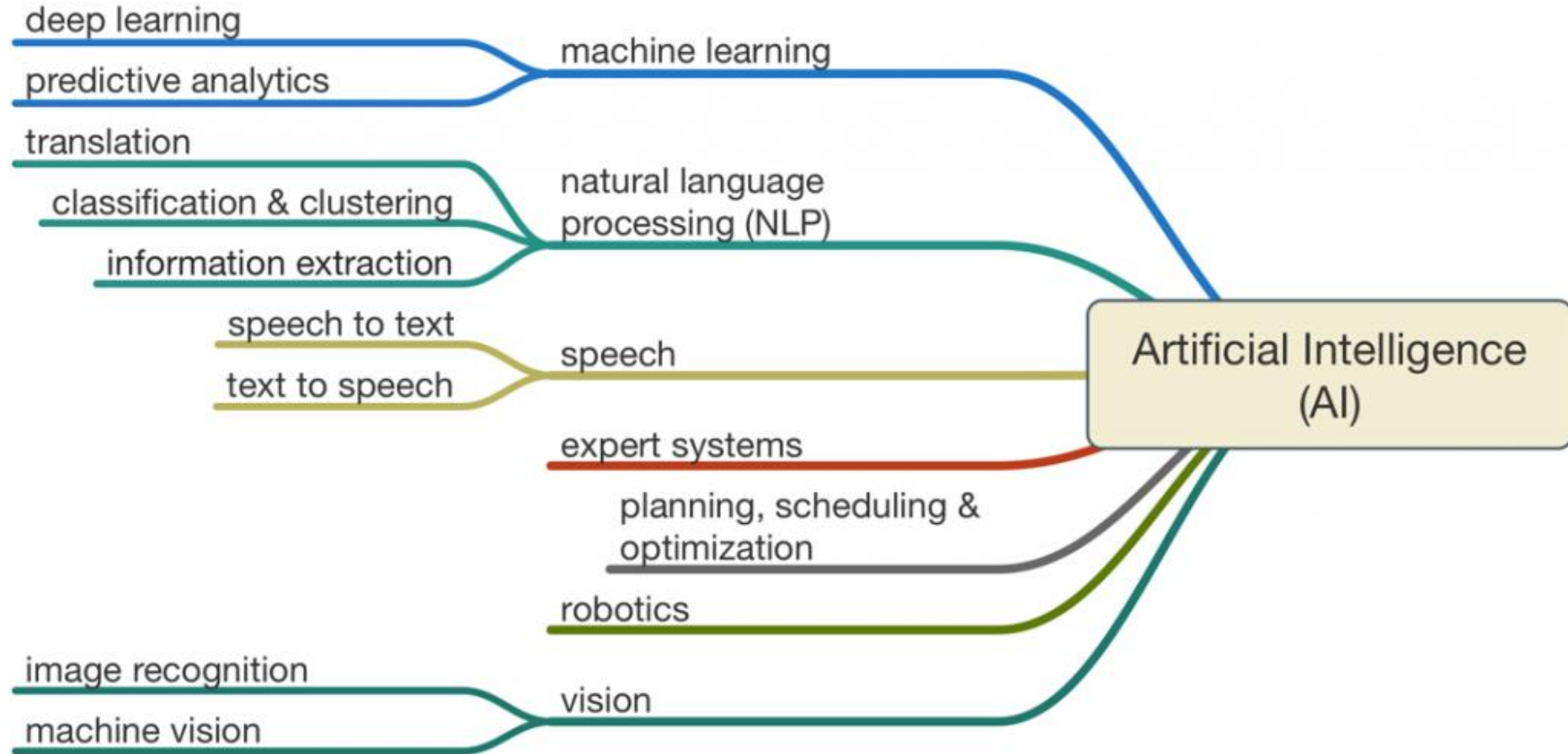
- 2.560 GB Ram
- 250 TB SAS Disk
- 4.800 GB SSD Disk
- 400 Core Intel Xeon Gold 6148 2.4 Ghz İşlemci
- 10 Gigabit Network

OS & Diğer Araçlar:

- Sunucu: Centos 7
- İstemci: Ubuntu Desktop 16.04
- Public Verisetleri
- Postman, DBeaver Robo3T, v.d.

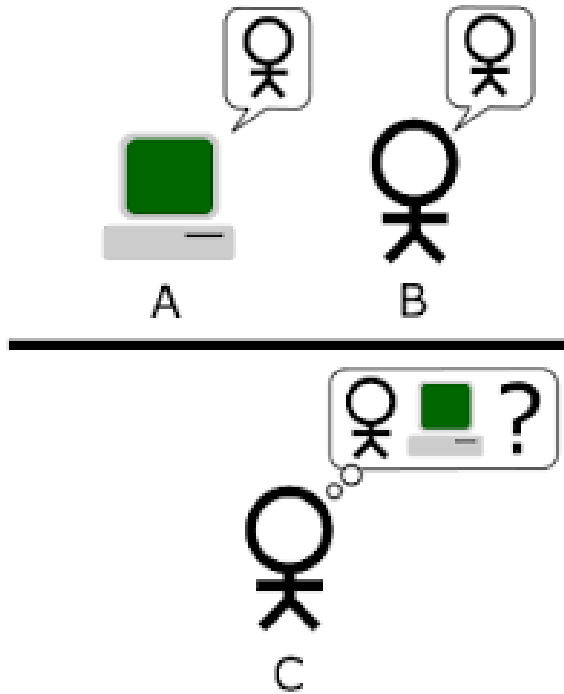
Daha fazlası için bab.btk.gov.tr

Yapay Zeka

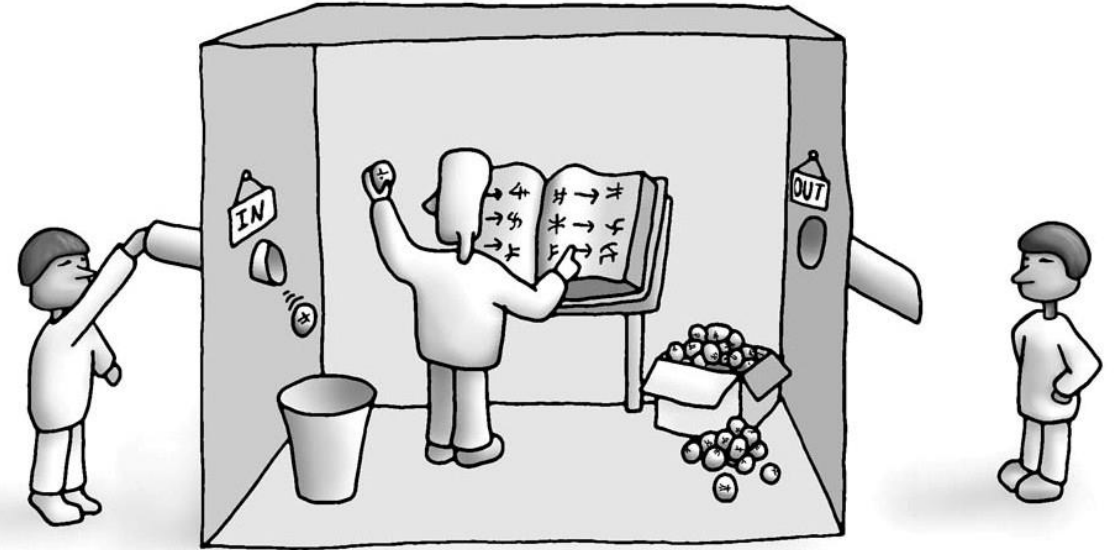


Yapay Zeka Testleri

1- Turing Testi



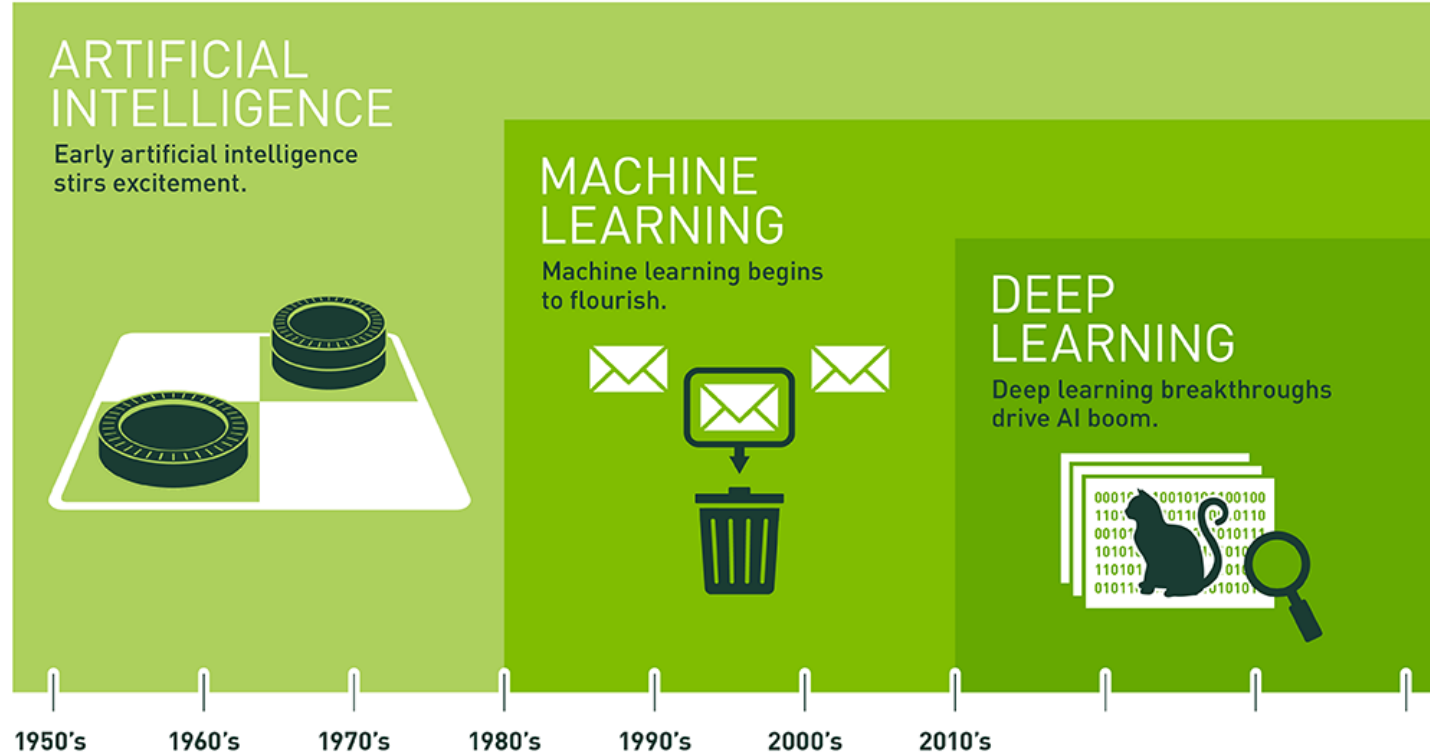
2- Çin Odası Deneyi



Kaynak 1: <http://www.wikizero.biz/index.php?q=aHR0cHM6Ly91cGxvYWQud2lraW1lZGlhLm9yZy93aWtpcGVkaWEvY29tbW9ucy9lL2U0L1R1cmLuZ19UZXR0X3ZlcnNpb25fMy5wbmc>

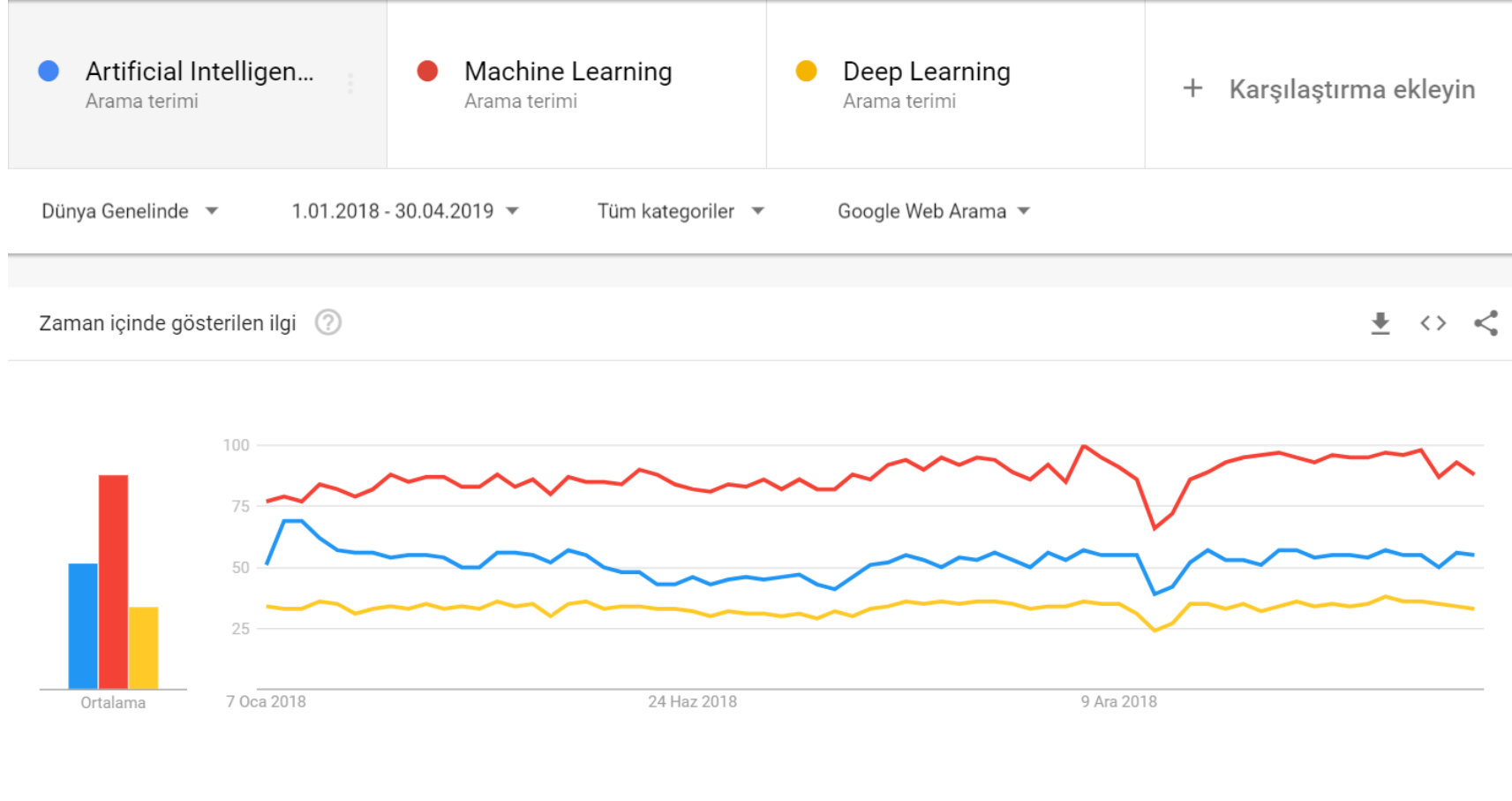
Kaynak 2: <https://cdnelektrikport.4fily.com//Content//201408/The-Chinese-Room.jpg>

Yapay Zeka & Makine Öğrenmesi & Derin Öğrenme



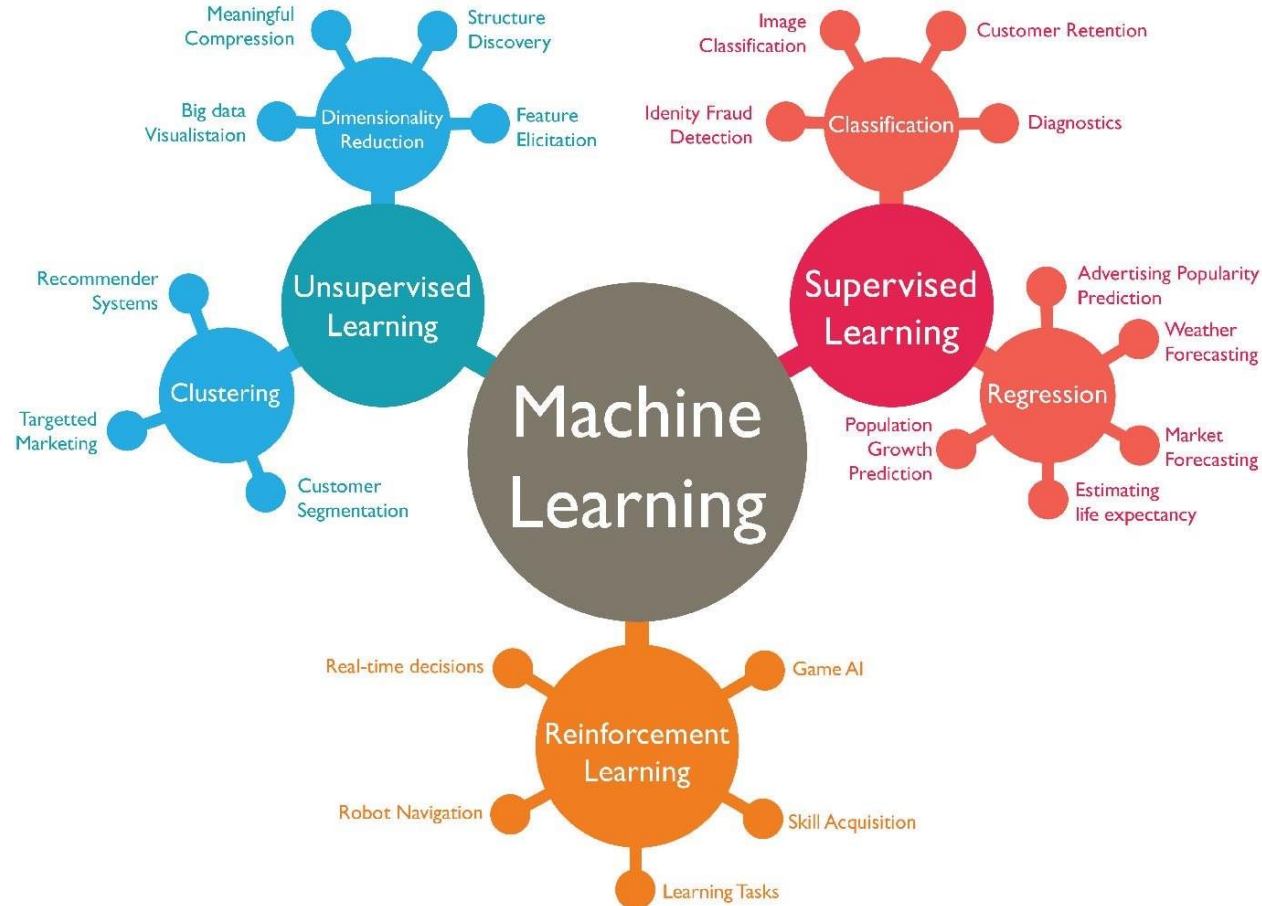
Since an early flush of optimism in the 1950s, smaller subsets of artificial intelligence – first machine learning, then deep learning, a subset of machine learning – have created ever larger disruptions.

Yapay Zeka & Makine Öğrenmesi & Derin Öğrenme



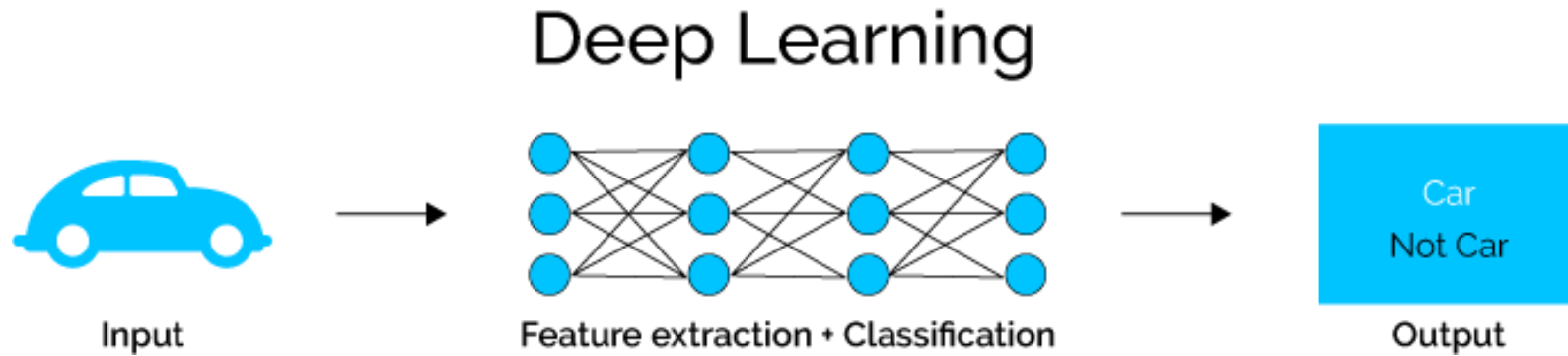
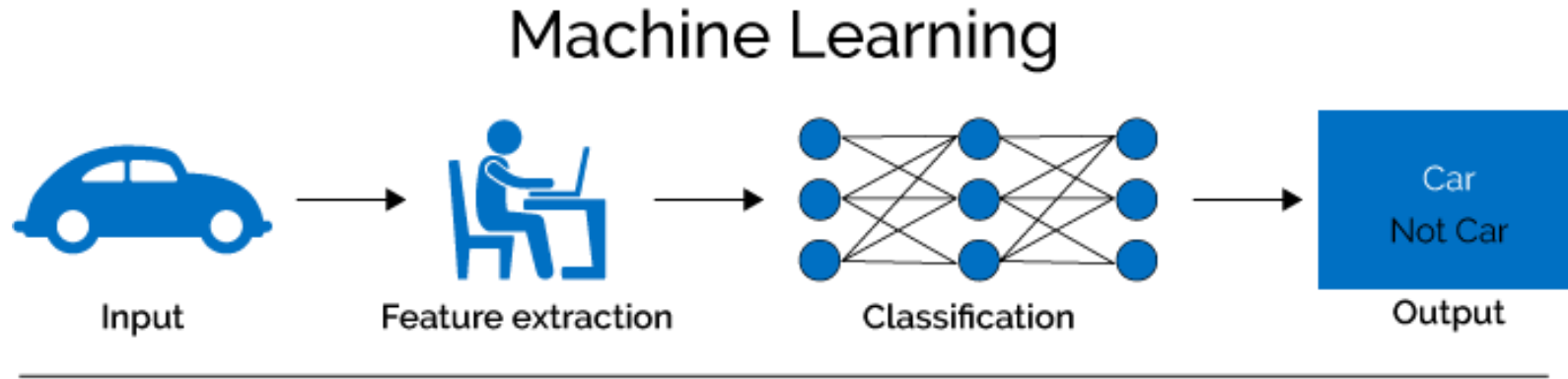
Kaynak: <https://trends.google.com.tr/trends/explore?date=2018-01-01%202019-04-30&q=Artificial%20Intelligence,Machine%20Learning,Deep%20Learning>

Makine Öğrenmesi



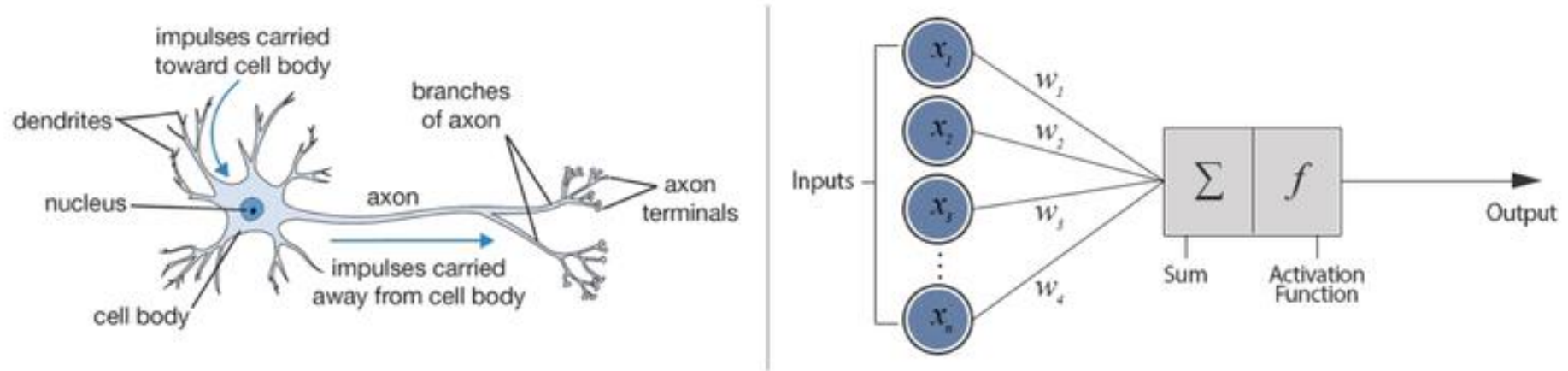
Kaynak: https://blogs.nvidia.com/wp-content/uploads/2016/07/Deep_Learning_Icons_R5_PNG.jpg.png

Makine Öğrenmesi vs Derin Öğrenme



Biyolojik Sinir Sistemi vs Yapay Sinir Ağları

Biological Neuron versus Artificial Neural Network



Peki Makineler Nasıl Öğrenir?

Bir problem ile başlayalım;

Input	0, 8, 15, 22, 38
Output	32, 46.4, 59, 71.6, 100.4

Adım 1: $0 * k + A = 32 \quad \rightarrow \quad A=32$

Adım 2: $8 * k + A = 46.4 \quad \rightarrow \quad 8 * k + 32 = 46.4 \quad \rightarrow \quad k=1.8$

Adım 3: $38 * 1.8 + 32 = 100.4$

Peki Makineler Nasıl Öğrenir?

Input

0, 8, 15, 22, 38,

Output

32, 46.4, 59, 71.6, 100.4

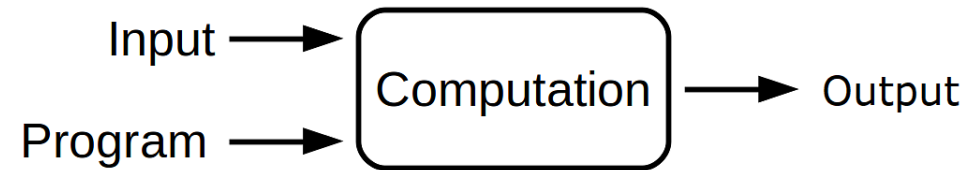
$$F = C * 1.8 + 32$$

F: Fahrenheit

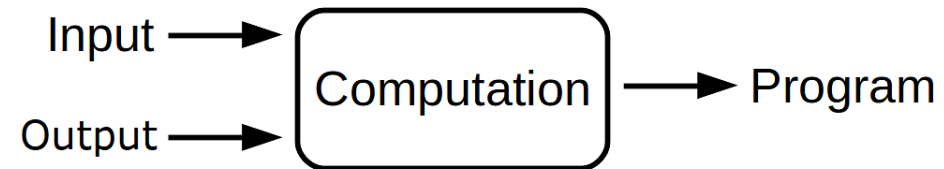
C: Celsius

Geleneksel Prog. vs Makine Öğrenmesi

Traditional programming



Machine learning



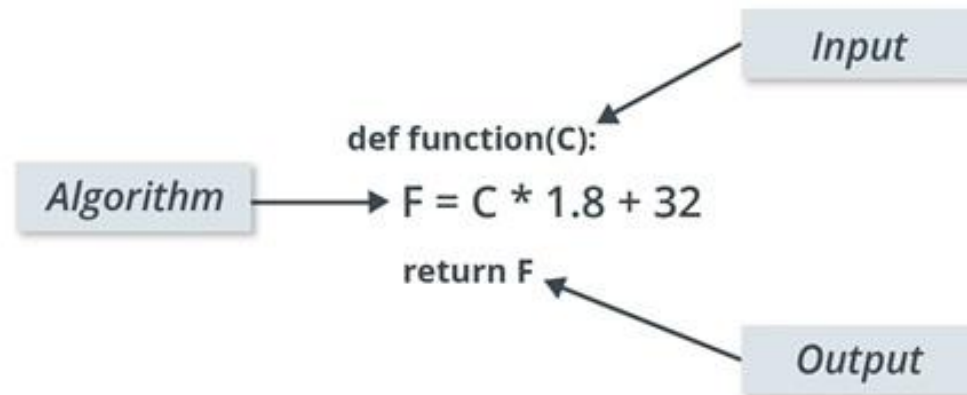
Geleneksel Programlama

$$F = C * 1.8 + 32$$

Python

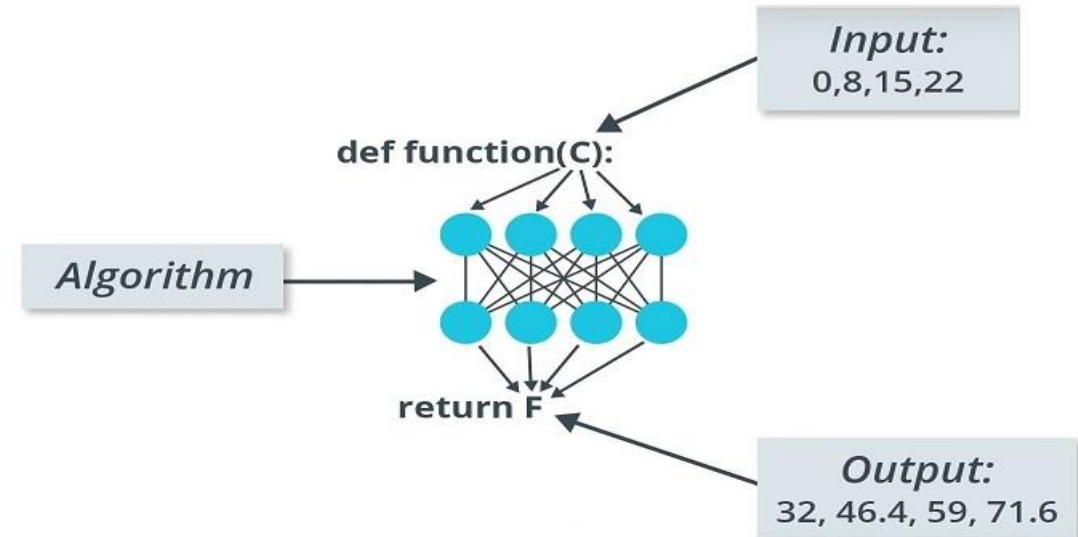
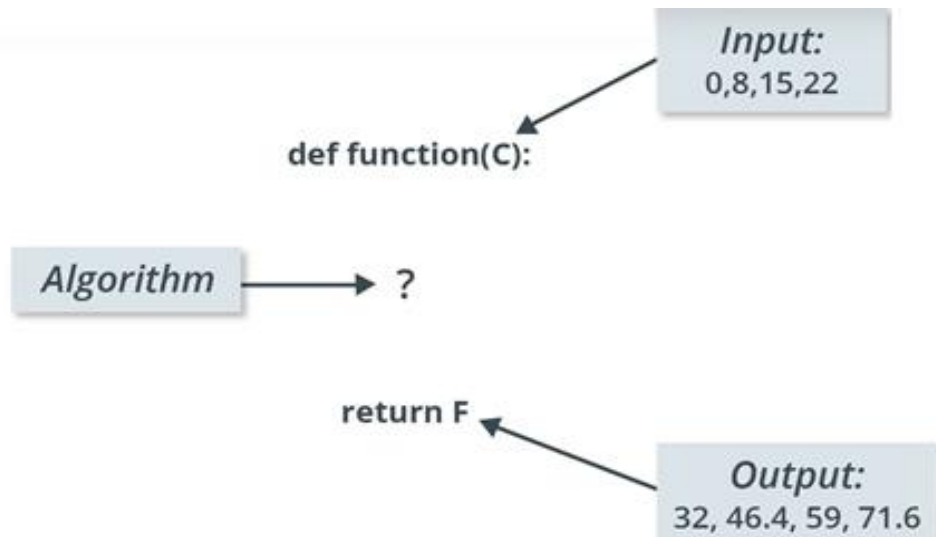
```
def Cel2Fah(C):  
    F = C * 1.8 + 32  
    return F
```

```
print("Celsius to Fahrenheit:", Cel2Fah(100))
```

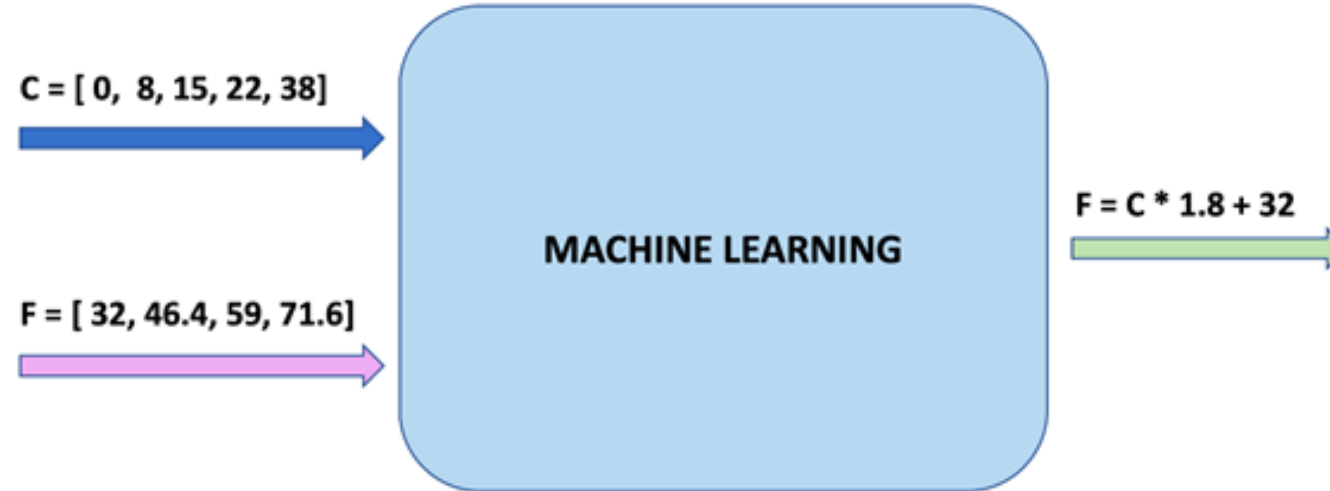


Makine Öğrenmesi

Python



Makine Öğrenmesi



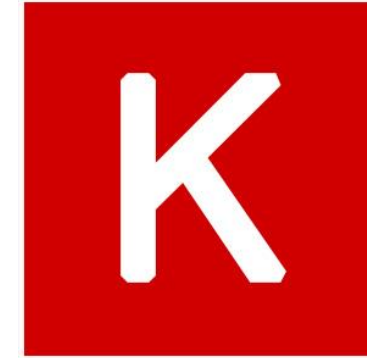
Python Uyg. (Veri Seti & Kütüphaneler)

No	Input	Output
1	-65	-85
2	-52	-61,6
3	-40	-40
4	-26	-14,8
5	-19	-2,2
...
...
...
46	520	968
47	533	991,4
48	546	1014,8
49	559	1038,2
50	572	1061,6

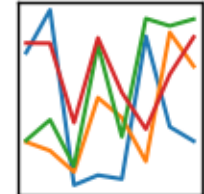
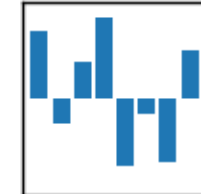
Python - Jupyter / Google Colab üzerinde, Input(Celsius) ve Output(Fahrenheit) değerlerinden oluşan 50 gözlemlili bir veri seti ile **Derin Sinir Ağları** ve **Doğrusal Regresyon** kullanarak Makine Öğrenmesi uygulaması gerçekleştireceğim.

Kütüphaneler

Tensorflow
Keras
ScikitLearn
Pandas
Numpy
Matplotlib



pandas
 $y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$



Python Uyg. (Sinir Ağları)

```
1 !python -V
2 !conda env list
```

```
Python 3.6.8 :: Anaconda, Inc.
```

```
# conda environments:
#
base                C:\ProgramData\Anaconda3
py36                 * C:\ProgramData\Anaconda3\envs\py36
py36_gpu             C:\ProgramData\Anaconda3\envs\py36_gpu
```

```
1 from __future__ import absolute_import, division, print_function, unicode_literals
2 import tensorflow as tf
3 tf.logging.set_verbosity(tf.logging.ERROR)
4
5 from sklearn.model_selection import train_test_split
6 from sklearn.utils import shuffle
7 import numpy as np           # Low-level numerical Python library.
8 import pandas as pd
9 import os
```

```
1 print("Working Directory:", os.getcwd())
2 print("Tensorflow Version:", tf.__version__)
3 print("Numpy Version:", np.__version__)
4 print("Pandas Version:", pd.__version__)
```

```
Working Directory: C:\Users\Metin USLU\Desktop\KaVe Sunum
Tensorflow Version: 1.13.1
Numpy Version: 1.15.4
Pandas Version: 0.24.1
```

Python Uyg. (Sinir Ağları)

```
1 data = pd.read_excel('dataset.xlsx', index=False, index_col=None, header=0, sheet_name='Sheet2', skiprows=2)
2
3 data = shuffle(data)
4 # data.head()
5
6 celsius = data['Celsius'].values
7 fahrenheit = data['Fahrenheit'].values
8
9 for i, c in enumerate(celsius[0:10]):
10     print("{} {} Celsius ==> {} Fahrenheit".format(i+1, c, round(fahrenheit[i],3)))
```

```
1. 221 Celsius ==> 429.8 Fahrenheit
2. 260 Celsius ==> 500.0 Fahrenheit
3. 247 Celsius ==> 476.6 Fahrenheit
4. 23 Celsius ==> 73.4 Fahrenheit
5. 572 Celsius ==> 1061.6 Fahrenheit
6. -65 Celsius ==> -85.0 Fahrenheit
7. 104 Celsius ==> 219.2 Fahrenheit
8. 338 Celsius ==> 640.4 Fahrenheit
9. 403 Celsius ==> 757.4 Fahrenheit
10. 390 Celsius ==> 734.0 Fahrenheit
```

```
1 l0 = tf.keras.layers.Dense(units=1, input_shape=[1])
```

```
1 model = tf.keras.Sequential([l0])
```

```
1 # model = tf.keras.Sequential([
2 #     tf.keras.layers.Dense(units=1, input_shape=[1])
3 # ])
```

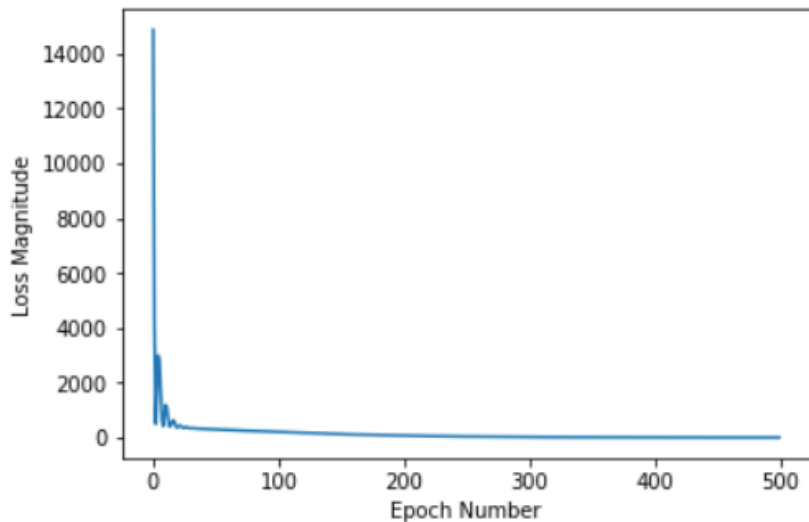
```
1 model.compile(loss='mean_squared_error',
2               optimizer=tf.keras.optimizers.Adam(0.1))
```

```
1 history = model.fit(celsius, fahrenheit, epochs=500, verbose=True)
2 print("Finished training the model")
```

Python Uyg. (Sinir Ağları)

```
1 import matplotlib.pyplot as plt
2 plt.xlabel('Epoch Number')
3 plt.ylabel("Loss Magnitude")
4 plt.plot(history.history['loss'])
```

[<matplotlib.lines.Line2D at 0x1ee2b5c89e8>]



```
1 print("These are the layer variables: {}".format(l0.get_weights()))
```

These are the layer variables: [array([[1.8024685]], dtype=float32), array([31.022383], dtype=float32)]

```
1 # print(l0.get_weights())
2 print("Fahrenheit = Celsius*{} + {}".format(float(l0.get_weights()[0]), float(l0.get_weights()[1])))
```

Fahrenheit = Celsius*1.8024685382843018 + 31.022382736206055

Python Uyg. (Sinir Ağları)

Celsius 100 için Fahrenheit : ?

❖ Sinir Ağları Modeli => $31.022 + 1.802 * \text{Celsius}$

$$31.022 + 1.802 * 100 = 211.269$$

❖ Cel2Fah => $100 * 1.8 + 32 = 212$

```
1 print("Celsius to Fahrenheit:", model.predict([100]))
```

Celsius to Fahrenheit: [[211.26924]]

```
1 def Cel2Fah(C):
2     F = C * 1.8 + 32
3     return F
```

```
1 print("Celsius to Fahrenheit:", Cel2Fah(100))
```

Celsius to Fahrenheit: 212.0

Python Uyg. (Regresyon)

```
1 !python -V
2 !conda env list
```

Python 3.6.8 :: Anaconda, Inc.

```
# conda environments:
#
base                C:\ProgramData\Anaconda3
py36                * C:\ProgramData\Anaconda3\envs\py36
py36_gpu            C:\ProgramData\Anaconda3\envs\py36_gpu
```

```
1 from sklearn import linear_model
2 from sklearn.metrics import mean_squared_error, r2_score
3 from sklearn.model_selection import train_test_split
4 import numpy as np
5 import pandas as pd
6 import xlrd
7 import os
8 import matplotlib.pyplot as plt
```

```
1 print("Working Directory:", os.getcwd())
2 print("Numpy Version:", np.__version__)
3 print("Pandas Version:", pd.__version__)
4 print("xlrd Version:", xlrd.__version__)
```

Working Directory: C:\Users\Metin USLU\Desktop\KaVe Sunum
Numpy Version: 1.15.4
Pandas Version: 0.24.1
xlrd Version: 1.2.0

Python Uyg. (Regresyon)

```
1 data = pd.read_excel('dataset.xlsx', index=False, index_col=None, header=0, sheet_name='Sheet2', skiprows=2)
```

```
1 data.head()
```

	Celsius	Fahrenheit
0	-65	-85.0
1	-52	-61.6
2	-40	-40.0
3	-26	-14.8
4	-19	-2.2

```
1 data.shape
```

(50, 2)

```
1 X = data.iloc[:, :-1]
2 y = data.iloc[:, 1]
3
4 X_Train, X_Test, y_Train, y_Test = train_test_split(X, y, test_size = .10, random_state = 0, shuffle=True)
```

Python Uyg. (Regresyon)

```
1 model = linear_model.LinearRegression()
```

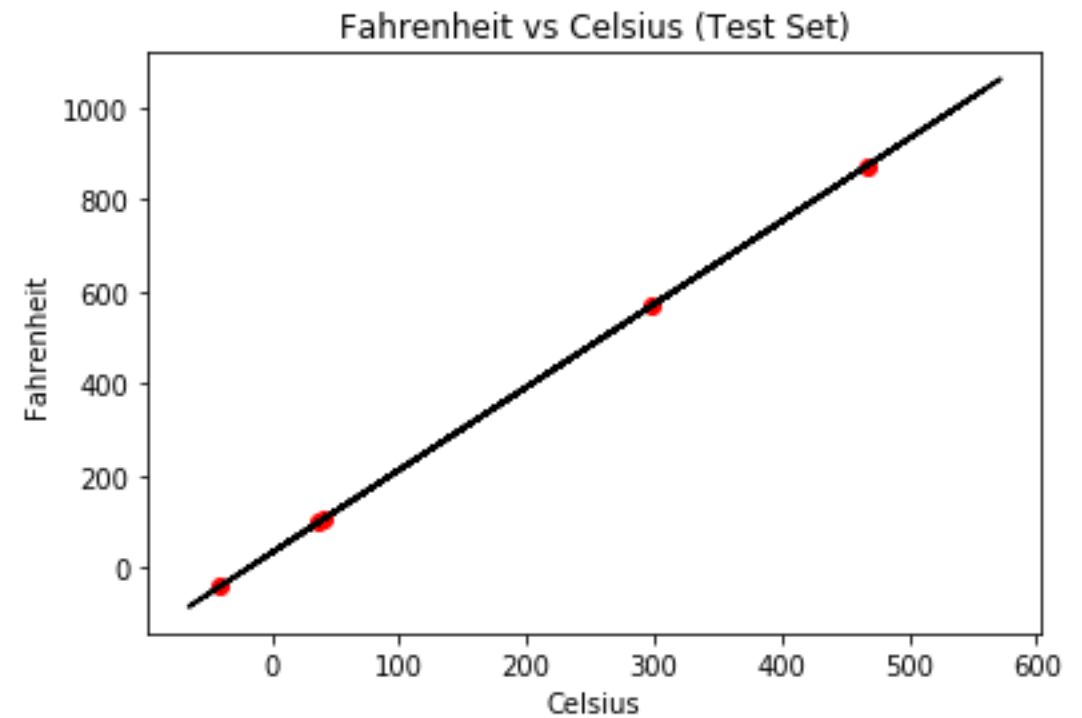
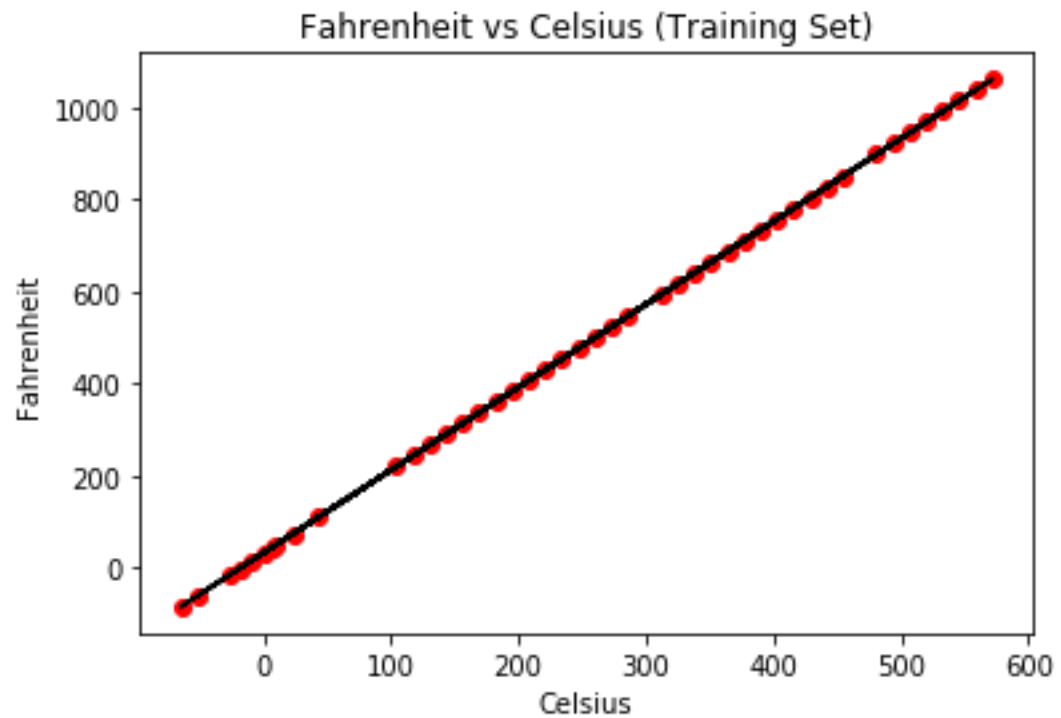
```
1 model.fit(X_Train, y_Train)
```

```
LinearRegression(copy_X=True, fit_intercept=True, n_jobs=None,  
                 normalize=False)
```

```
1 y_Pred = model.predict(X_Test)  
2 y_Pred
```

```
array([570.2, 105.8, 98.6, 874.4, -40. ])
```

Python Uyg. (Regresyon)



Python Uyg. (Regresyon)

```
1 print("Fahrenheit = Celsius*{} + {}".format(model.coef_[0], model.intercept_) )
```

```
Fahrenheit = Celsius*1.8000000000000001 + 31.999999999999773
```

Regresyon Modeli

$$y = b_0 + b_1 * x_1 == > y = \text{Celcius} * 1.8 + 31.999$$

Python Uyg. (Regresyon)

Celsius 100 için Fahrenheit : ?

- ❖ Regresyon Modeli $\Rightarrow y = \text{Celsius} * 1.8 + 31.999$
 $100 * 1.8 + 31.999 = 211.999$
- ❖ Cel2Fah $\Rightarrow 100 * 1.8 + 32 = 212$

```
1 y_new = model.predict([[100]])  
2 print(y_new)
```

[212.]

```
1 def Cel2Fah(C):  
2     F = C * 1.8 + 32  
3     return F
```

```
1 print("Celsius to Fahrenheit:", Cel2Fah(100))
```

Celsius to Fahrenheit: 212.0

Modeller

❖ Cel2Fah $\Rightarrow \text{Celsius} * 1.8 + 32$

❖ Sinir Ağı Modeli $\Rightarrow \text{Celcius} * 1.802 + 31.022$

❖ Regresyon Modeli $\Rightarrow \text{Celcius} * 1.8 + 31.999$

Github Repository : https://github.com/metinuslu/kave2019_machinelearning

Teşekkürler

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İletişim

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