

PYTHON PROGRAMLAMAYA

GİRİŞ

Hafta 11

PYTHON PROGRAMLAMA

- pandas kapsamında kullanılan, Pivot tablo, dataframe ile kolayca işlem yapılmasını sağlayan bir tool'dur.

PYTHON PROGRAMLAMA

- pandas, Python programlama dilinde kullanılan açık kaynak kodlu **bir veri analizi** kütüphanesidir.

PYTHON PROGRAMLAMA

- pandas kütüphanesinde bulunan temel veri yapıları:
- Series
- DataFrame

PYTHON PROGRAMLAMA

- Pivot tablo fonksiyonu pandas kütüphanesinin bir fonksiyonudur.

PYTHON PROGRAMLAMA

- Pandas veri yapısı olan dataframe; satır, sütun ve indeks'ten meydana gelir.
- Dataframe'in her bir sütunu **sadece bir tek veri türünü** saklamaktadır.

PYTHON PROGRAMLAMA

- Pivot tablo için en az bir index ve bir dataframe kullanılmaktadır.

PYTHON PROGRAMLAMA

- pandas pivot_table fonksiyonu veri analizi için kullanılır.

PYTHON PROGRAMLAMA

- veri seti için link:
- <https://raw.githubusercontent.com/SciRuby/darui/master/spec/fixtures/csv/sales-funnel.csv>

PYTHON PROGRAMLAMA

- veri seti görünümü:
- 714466,Trantow-Barrows,Craig Booker,Debra Henley,CPU,1,30000,presented
- 714466,Trantow-Barrows,Craig Booker,Debra Henley,Software,1,10000,presented
- 714466,Trantow-Barrows,Craig Booker,Debra Henley,Maintenance,2,5000,pending
- 737550,"Fritsch, Russel and Anderson",Craig Booker,Debra Henley,CPU,1,35000,declined
- 146832,Kiehn-Spinka,Daniel Hilton,Debra Henley,CPU,2,65000,won
- 218895,Kulas Inc,Daniel Hilton,Debra Henley,CPU,2,40000,pending
- 218895,Kulas Inc,Daniel Hilton,Debra Henley,Software,1,10000,presented
- 412290,Jerde-Hilpert,John Smith,Debra Henley,Maintenance,2,5000,pending
- 740150,Barton LLC,John Smith,Debra Henley,CPU,1,35000,declined
- 141962,Herman LLC,Cedric Moss,Fred Anderson,CPU,2,65000,won
- 163416,Purdy-Kunde,Cedric Moss,Fred Anderson,CPU,1,30000,presented
- 239344,Stokes LLC,Cedric Moss,Fred Anderson,Maintenance,1,5000,pending
- 239344,Stokes LLC,Cedric Moss,Fred Anderson,Software,1,10000,presented
- 307599,"Kassulke, Ondricka and Metz",Wendy Yule,Fred Anderson,Maintenance,3,7000,won
- 688981,Keeling LLC,Wendy Yule,Fred Anderson,CPU,5,100000,won
- 729833,Koepp Ltd,Wendy Yule,Fred Anderson,CPU,2,65000,declined
- 729833,Koepp Ltd,Wendy Yule,Fred Anderson,Monitor,2,5000,presented

PYTHON PROGRAMLAMA

- `import pandas as pd`
- `import numpy as np`

PYTHON PROGRAMLAMA

- # datasetin dataFrame'e alınması:
- df =
pd.read_csv("https://raw.githubusercontent.com/SciRuby/daru-io/master/spec/fixtures/csv/sales-funnel.csv")

PYTHON PROGRAMLAMA

- # dataFrame'deki ilk 5 veri:
- `df.head()`

PYTHON PROGRAMLAMA

- Account Name Rep Manager Product Quantity
 Price Status
- 0 714466 Trantow-Barrows Craig Booker Debra Henley
 CPU 1 30000 presented
- 1 714466 Trantow-Barrows Craig Booker Debra Henley
 Software 1 10000 presented
- 2 714466 Trantow-Barrows Craig Booker Debra Henley
 Maintenance 2 5000 pending
- 3 737550 Fritsch, Russel and Anderson Craig Booker Debra
 Henley CPU 1 35000 declined
- 4 146832 Kiehn-Spinka Daniel Hilton Debra Henley CPU
 2 65000 won

PYTHON PROGRAMLAMA

- # bütün dataFrame'in listesi
- `print(df)`

PYTHON PROGRAMLAMA

Account	Name	Rep	Manager \
0 714466	Trantow-Barrows	Craig Booker	Debra Henley
1 714466	Trantow-Barrows	Craig Booker	Debra Henley
2 714466	Trantow-Barrows	Craig Booker	Debra Henley
3 737550	Fritsch, Russel and Anderson	Craig Booker	Debra Henley
4 146832	Kiehn-Spinka	Daniel Hilton	Debra Henley
5 218895	Kulas Inc	Daniel Hilton	Debra Henley
6 218895	Kulas Inc	Daniel Hilton	Debra Henley
7 412290	Jerde-Hilpert	John Smith	Debra Henley
8 740150	Barton LLC	John Smith	Debra Henley
9 141962	Herman LLC	Cedric Moss	Fred Anderson
10 163416	Purdy-Kunde	Cedric Moss	Fred Anderson
11 239344	Stokes LLC	Cedric Moss	Fred Anderson
12 239344	Stokes LLC	Cedric Moss	Fred Anderson
13 307599	Kassulke, Ondricka and Metz	Wendy Yule	Fred Anderson
14 688981	Keeling LLC	Wendy Yule	Fred Anderson
15 729833	Koepp Ltd	Wendy Yule	Fred Anderson
16 729833	Koepp Ltd	Wendy Yule	Fred Anderson

PYTHON PROGRAMLAMA

- # Pivot tablonun için **bir dataFrame ve bir indeks** gerekli olmaktadır.
- Bu örnekte, Name indeks olarak olarak belirlenmiştir.
- `pd.pivot_table(df,index=["Name"])`

PYTHON PROGRAMLAMA

	Account	Price	Quantity		
• Name					
• Barton LLC	740150	35000	1.000000		
• Fritsch, Russel and Anderson			737550	35000	1.000000
• Herman LLC	141962	65000	2.000000		
• Jerde-Hilpert	412290	5000	2.000000		
• Kassulke, Ondricka and Metz			307599	7000	3.000000
• Keeling LLC	688981	100000	5.000000		
• Kiehn-Spinka	146832	65000	2.000000		
• Koepp Ltd	729833	35000	2.000000		
• Kulas Inc	218895	25000	1.500000		
• Purdy-Kunde	163416	30000	1.000000		
• Stokes LLC	239344	7500	1.000000		
• Trantow-Barrows		714466	15000	1.333333	

PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Name","Rep","Manager"])`

PYTHON PROGRAMLAMA

Account	Price	Quantity			
Name	Rep	Manager			
Barton LLC	John Smith	Debra Henley	740150	35000	1.000000
Fritsch, Russel and Anderson	Craig Booker	Debra Henley	737550	35000	1.000000
Herman LLC	Cedric Moss	Fred Anderson	141962	65000	2.000000
Jerde-Hilpert	John Smith	Debra Henley	412290	5000	2.000000
Kassulke, Ondricka and Metz	Wendy Yule	Fred Anderson	307599	7000	3.000000
Keeling LLC	Wendy Yule	Fred Anderson	688981	100000	5.000000
Kiehn-Spinka	Daniel Hilton	Debra Henley	146832	65000	2.000000
Koepp Ltd	Wendy Yule	Fred Anderson	729833	35000	2.000000
Kulas Inc	Daniel Hilton	Debra Henley	218895	25000	1.500000
Purdy-Kunde	Cedric Moss	Fred Anderson	163416	30000	1.000000
Stokes LLC	Cedric Moss	Fred Anderson	239344	7500	1.000000
Trantow-Barrows	Craig Booker	Debra Henley	714466	15000	1.333333

PYTHON PROGRAMLAMA

- `pd.pivot_table(df, index=["Manager","Rep"])`

PYTHON PROGRAMLAMA

Account		Price	Quantity		
Manager		Rep			
Debra Henley		Craig Booker	720237.0	20000.000000	1.250000
		Daniel Hilton	194874.0	38333.333333	1.666667
		John Smith	576220.0	20000.000000	1.500000
Fred Anderson		Cedric Moss	196016.5	27500.000000	1.250000
		Wendy Yule	614061.5	44250.000000	3.000000

PYTHON PROGRAMLAMA

- `pd.pivot_table(df,
index=["Manager","Rep"],values=["Price"])`

PYTHON PROGRAMLAMA



		Price
Manager	Rep	
Debra Henley	Craig Booker	20000.000000
	Daniel Hilton	38333.333333
	John Smith	20000.000000
Fred Anderson	Cedric Moss	27500.000000
	Wendy Yule	44250.000000

PYTHON PROGRAMLAMA

- `# DataFrame'deki toplam veri sayısı`
- `df.size`
- Ekran Çıktısı:
- 136

PYTHON PROGRAMLAMA

- # dataFrame'deki satır ve sütun sayısı
- df.shape
- Ekran Çıktısı
- (17, 8)

PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep"],values=["Price"],aggfunc=np.sum)`

PYTHON PROGRAMLAMA



		Price
Manager	Rep	
Debra Henley	Craig Booker	80000
	Daniel Hilton	115000
	John Smith	40000
Fred Anderson	Cedric Moss	110000
	Wendy Yule	177000

PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep"],values=["Price"],aggfunc=[np.mean,len])`

PYTHON PROGRAMLAMA



		mean	len
		Price	Price
Manager	Rep		
Debra Henley	Craig Booker	20000.000000	4
	Daniel Hilton	38333.333333	3
	John Smith	20000.000000	2
Fred Anderson	Cedric Moss	27500.000000	4
	Wendy Yule	44250.000000	4

PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep"],values=["Price"],
columns=["Product"],aggfunc=[np.sum])`

PYTHON PROGRAMLAMA

--	--

		sum				
		Price				
		CPU	Maintenan	Monitor	Software	
		ce				
Manager	Rep					
Debra Henley	Craig Booker	65000.0	5000.0	NaN	10000.0	
	Daniel Hilton	105000.0	NaN	NaN	10000.0	
	John Smith	35000.0	5000.0	NaN	NaN	
Fred Anderson	Cedric Moss	95000.0	5000.0	NaN	10000.0	
	Wendy Yule	165000.0	7000.0	5000.0	NaN	

PYTHON PROGRAMLAMA

- ```
pd.pivot_table(df,index=["Manager","Rep"],values=["P
rice"],
columns=["Product"],aggfunc=[np.sum],fill_value=0)
```

# PYTHON PROGRAMLAMA

|                  |               |        |             |         |          |  |
|------------------|---------------|--------|-------------|---------|----------|--|
| ●                |               |        | sum         |         |          |  |
|                  |               |        | price       |         |          |  |
|                  |               |        |             |         |          |  |
|                  | Product       | CPU    | Maintenance | Monitor | Software |  |
| Manager          | Rep           |        |             |         |          |  |
| Debra<br>Henley  | Craig Booker  | 65000  | 5000        | 0       | 10000    |  |
|                  | Daniel Hilton | 105000 | 0           | 0       | 10000    |  |
|                  | John Smith    | 35000  | 5000        | 0       | 0        |  |
| Fred<br>Anderson | Cedric Moss   | 95000  | 5000        | 0       | 10000    |  |
|                  | Wendy Yule    | 165000 | 7000        | 5000    | 0        |  |

# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep"],values=["Price","Quantity"],  
columns=["Product"],aggfunc=[np.sum],fill_value=0)`

# PYTHON PROGRAMLAMA



|                  |                  | Sum    |                 |         |          |          |                 |         |          |  |  |
|------------------|------------------|--------|-----------------|---------|----------|----------|-----------------|---------|----------|--|--|
|                  |                  | Price  |                 |         |          | Quantity |                 |         |          |  |  |
| Product          |                  | CPU    | Mainten<br>ance | Monitor | Software | CPU      | Mainten<br>ance | Monitor | Software |  |  |
| Manager          | Rep              |        |                 |         |          |          |                 |         |          |  |  |
| Debra<br>Henley  | Craig<br>Booker  | 65000  | 5000            | 0       | 10000    | 2        | 2               | 0       | 1        |  |  |
|                  | Daniel<br>Hilton | 105000 | 0               | 0       | 10000    | 4        | 0               | 0       | 1        |  |  |
|                  | John<br>Smith    | 35000  | 5000            | 0       | 0        | 1        | 2               | 0       | 0        |  |  |
| Fred<br>Anderson | Cedric<br>Moss   | 95000  | 5000            | 0       | 10000    | 3        | 1               | 0       | 1        |  |  |
|                  | Wendy<br>Yule    | 165000 | 7000            | 5000    | 0        | 7        | 3               | 2       | 0        |  |  |

# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep","Product"],`
- `values=["Price","Quantity"],aggfunc=[np.sum],fill_value=0)`

| National Program Areas |               |             | sum<br>Price | Quantity |
|------------------------|---------------|-------------|--------------|----------|
| Manager                | Rep           | Product     |              |          |
| Debra Henley           | Craig Booker  | CPU         | 65000        | 2        |
|                        |               | Maintenance | 5000         | 2        |
|                        |               | Software    | 10000        | 1        |
|                        | Daniel Hilton | CPU         | 105000       | 4        |
|                        |               | Software    | 10000        | 1        |
|                        | John Smith    | CPU         | 35000        | 1        |
|                        |               | Maintenance | 5000         | 2        |
| Fred Anderson          | Cedric Moss   | CPU         | 95000        | 3        |
|                        |               | Maintenance | 5000         | 1        |
|                        |               | Software    | 10000        | 1        |
|                        | Wendy Yule    | CPU         | 165000       | 7        |
|                        |               | Maintenance | 7000         | 3        |
|                        |               | Monitor     | 5000         | 2        |

# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep","Product"],`
- `values=["Price","Quantity"],`
- `aggfunc=[np.sum,np.mean],fill_value=0)`

# PYTHON PROGRAMLAMA

| ●             | sum           |             | mean     |       |          |     |
|---------------|---------------|-------------|----------|-------|----------|-----|
|               |               | Price       | Quantity | Price | Quantity |     |
| Manager       | Rep           | Product     |          |       |          |     |
| Debra Henley  | Craig Booker  | CPU         | 65000    | 2     | 32500    | 1.0 |
|               |               | Maintenance | 5000     | 2     | 5000     | 2.0 |
|               |               | Software    | 10000    | 1     | 10000    | 1.0 |
|               | Daniel Hilton | CPU         | 105000   | 4     | 52500    | 2.0 |
|               |               | Software    | 10000    | 1     | 10000    | 1.0 |
|               | John Smith    | CPU         | 35000    | 1     | 35000    | 1.0 |
|               |               | Maintenance | 5000     | 2     | 5000     | 2.0 |
| Fred Anderson | Cedric Moss   | CPU         | 95000    | 3     | 47500    | 1.5 |
|               |               | Maintenance | 5000     | 1     | 5000     | 1.0 |
|               |               | Software    | 10000    | 1     | 10000    | 1.0 |
|               | Wendy Yule    | CPU         | 165000   | 7     | 82500    | 3.5 |
|               |               | Maintenance | 7000     | 3     | 7000     | 3.0 |
|               |               | Monitor     | 5000     | 2     | 5000     | 2.0 |
|               |               |             |          |       |          |     |



# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Rep","Product"],`
- `values=["Price","Quantity"],`
- `aggfunc=[np.sum,np.mean],fill_value=0,margins=True`  
`)`

# PYTHON PROGRAMLAMA

| sum           |               | mean        |        |          |          |          |
|---------------|---------------|-------------|--------|----------|----------|----------|
|               |               | Price       |        | Quantity | Price    | Quantity |
| Manager       | Rep           | Product     |        |          |          |          |
| Debra Henley  | Craig Booker  | CPU         | 65000  | 2        | 32500    | 1.000000 |
|               |               | Maintenance | 5000   | 2        | 5000     | 2.000000 |
|               |               | Software    | 10000  | 1        | 10000    | 1.000000 |
|               | Daniel Hilton | CPU         | 105000 | 4        | 52500    | 2.000000 |
|               |               | Software    | 10000  | 1        | 10000    | 1.000000 |
|               | John Smith    | CPU         | 35000  | 1        | 35000    | 1.000000 |
| Maintenance   |               | 5000        | 2      | 5000     | 2.000000 |          |
| Fred Anderson | Cedric Moss   | CPU         | 95000  | 3        | 47500    | 1.500000 |
|               |               | Maintenance | 5000   | 1        | 5000     | 1.000000 |
|               |               | Software    | 10000  | 1        | 10000    | 1.000000 |
|               | Wendy Yule    | CPU         | 165000 | 7        | 82500    | 3.500000 |
|               |               | Maintenance | 7000   | 3        | 7000     | 3.000000 |
|               |               | Monitor     | 5000   | 2        | 5000     | 2.000000 |
| All           |               | 522000      | 30     | 30705    | 1.764706 |          |

# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Status"],values=["Price"],`
- `aggfunc=[np.sum],fill_value=0,margins=True)`

# PYTHON PROGRAMLAMA



|  |  |
|--|--|
|  |  |
|--|--|

**sum**

**price**

**Manager**

**Status**

**Debra Henley**

**won**

**65000**

**pending**

**50000**

**presented**

**50000**

**declined**

**70000**

**Fred Anderson**

**won**

**172000**

**pending**

**5000**

**presented**

**45000**

**declined**

**65000**

**All**

**522000**

# PYTHON PROGRAMLAMA

- `pd.pivot_table(df,index=["Manager","Status"],columns=["Product"],values=["Quantity","Price"],`
- `aggfunc={"Quantity":len,"Price":np.sum},fill_value=0)`

# PYTHON PROGRAMLAMA

| Price            | Quantity  |        |                 |         |          |     |                 |         |          |  |
|------------------|-----------|--------|-----------------|---------|----------|-----|-----------------|---------|----------|--|
|                  | Product   | CPU    | Mainten<br>ance | Monitor | Software | CPU | Maintena<br>nce | Monitor | Software |  |
| Manager          | Status    |        |                 |         |          |     |                 |         |          |  |
| Debra<br>Henley  | won       | 65000  | 0               | 0       | 0        | 1   | 0               | 0       | 0        |  |
|                  | pending   | 40000  | 10000           | 0       | 0        | 1   | 2               | 0       | 0        |  |
|                  | presented | 30000  | 0               | 0       | 20000    | 1   | 0               | 0       | 2        |  |
|                  | declined  | 70000  | 0               | 0       | 0        | 2   | 0               | 0       | 0        |  |
| Fred<br>Anderson | won       | 165000 | 7000            | 0       | 0        | 2   | 1               | 0       | 0        |  |
|                  | pending   | 0      | 5000            | 0       | 0        | 0   | 1               | 0       | 0        |  |
|                  | presented | 30000  | 0               | 5000    | 10000    | 1   | 0               | 1       | 1        |  |
|                  | declined  | 65000  | 0               | 0       | 0        | 1   | 0               | 0       | 0        |  |

# PYTHON PROGRAMLAMA

- `table =`  
`pd.pivot_table(df,index=["Manager","Status"],columns`  
`=["Product"],values=["Quantity","Price"],`  
`aggfunc={"Quantity":len,"Price":[np.sum,np.mean]},fil`  
`l_value=0)`
- `table`

# PYTHON PROGRAMLAMA

- `table.query('Manager == ["Debra Henley"]')`



# PYTHON PROGRAMLAMA

| Price   |           | Quantity |             |         |          |       |             |         |          |     |             |         |          |
|---------|-----------|----------|-------------|---------|----------|-------|-------------|---------|----------|-----|-------------|---------|----------|
|         |           | mean     |             |         |          | sum   |             |         |          | len |             |         |          |
| Manager | Product   | CPU      | Maintenance | Monitor | Software | CPU   | Maintenance | Monitor | Software | CPU | Maintenance | Monitor | Software |
|         | Status    |          |             |         |          |       |             |         |          |     |             |         |          |
|         | won       | 65000    | 0           | 0       | 0        | 65000 | 0           | 0       | 0        | 1   | 0           | 0       |          |
|         | pending   | 40000    | 5000        | 0       | 0        | 40000 | 10000       | 0       | 0        | 1   | 2           | 0       |          |
|         | presented | 30000    | 0           | 0       | 10000    | 30000 | 0           | 0       | 20000    | 1   | 0           | 0       |          |
|         | declined  | 35000    | 0           | 0       | 0        | 70000 | 0           | 0       | 0        | 2   | 0           | 0       |          |

# PYTHON PROGRAMLAMA

- `table.query('Status == ["pending","won"]')`

# PYTHON PROGRAMLAMA

| Price         | Quantity |             |         |          |     |             |         |          |     |             |   |
|---------------|----------|-------------|---------|----------|-----|-------------|---------|----------|-----|-------------|---|
|               | mean     | sum         |         |          |     | len         |         |          |     |             |   |
| Product       | CPU      | Maintenance | Monitor | Software | CPU | Maintenance | Monitor | Software | CPU | Maintenance |   |
| Manager       | Status   |             |         |          |     |             |         |          |     |             |   |
| Debra Menley  | pending  | 40000       | 5000    | 0        | 0   | 40000       | 10000   | 0        | 0   | 1           | 2 |
|               | won      | 65000       | 0       | 0        | 0   | 65000       | 0       | 0        | 0   | 1           | 0 |
| Fred Anderson | pending  | 0           | 5000    | 0        | 0   | 0           | 5000    | 0        | 0   | 0           | 1 |
|               | won      | 82500       | 7000    | 0        | 0   | 165000      | 7000    | 0        | 0   | 2           | 1 |

# PYTHON PROGRAMLAMA

- Dataset ve Python kodları, Chris Moffitt'in 'Pandas Pivot Table Explained' adlı yazısından [‘https://pbpython.com/pandas-pivot-table-explained.html’](https://pbpython.com/pandas-pivot-table-explained.html) linkinden alınmıştır.

# PYTHON PROGRAMLAMA

## Kaynaklar:

<https://pbpython.com/pandas-pivot-table-explained.html>

<https://cmdlinetips.com/2018/12/pivot-table-in-python-pandas/>

<https://jakevdp.github.io/PythonDataScienceHandbook/03.09-pivot-tables.html>

<https://datatofish.com/pivot-table-python/>

<http://www.gregreda.com/2013/10/26/intro-to-pandas-data-structures/>

<https://pandas.pydata.org/pandas-docs/stable/reference/api/pandas.DataFrame.describe.html>