Pandas - 4

Content

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Importing Data

```
import pandas as pd
import numpy as np
!gdown 1s2TkjSpzNc4SyxqRrQleZyDIHlc7bxnd
!gdown 1Ws-_s1fHZ9nHfGLVUQurbHDvStePlEJm
movies = pd.read_csv('movies.csv', index_col=0)
directors = pd.read_csv('directors.csv',index_col=0)
data = movies.merge(directors, how='left', left_on='director_id',right_on='id')
data.drop(['director_id','id_y'],axis=1,inplace=True)
     Downloading...
     From: <a href="https://drive.google.com/uc?id=1s2TkjSpzNc4SyxqRr0leZyDIHlc7bxnd">https://drive.google.com/uc?id=1s2TkjSpzNc4SyxqRr0leZyDIHlc7bxnd</a>
     To: /content/movies.csv
     100% 112k/112k [00:00<00:00, 15.4MB/s]
     Downloading...
     From: <a href="https://drive.google.com/uc?id=1Ws-s1fHZ9nHfGLVUQurbHDvStePlEJm">https://drive.google.com/uc?id=1Ws-s1fHZ9nHfGLVUQurbHDvStePlEJm</a>
     To: /content/directors.csv
     100% 65.4k/65.4k [00:00<00:00, 86.7MB/s]
```

Multi-Indexing

- ▼ Task: Which director according would be considered as most productive?
 - Should we decide based on the number of movies released by a director?

Or

· consider quality into consideration also?

Or

• consider the amount of business the movie is doing?

To simplify,

Lets calculate who has directed maximum number of movies

data.groupby(['director_name'])['title'].count().sort_values(ascending=False)

```
director_name
Steven Spielberg
                    26
Clint Eastwood
                    19
Martin Scorsese
                    19
Woody Allen
                    18
Robert Rodriguez
                    16
Paul Weitz
John Madden
                     5
Paul Verhoeven
John Whitesell
Kevin Reynolds
Name: title, Length: 199, dtype: int64
```

calculating active years for every director?

We can subtract both min and max of year

data_agg = data.groupby(['director_name'])[["year", "title"]].aggregate({"year":['min','max'], "title": "count"})
data_agg

	year		title
	min	max	count
director_name			
Adam McKay	2004	2015	6
Adam Shankman	2001	2012	8
Alejandro González Iñárritu	2000	2015	6
Alex Proyas	1994	2016	5
Alexander Payne	1999	2013	5
Wes Craven	1984	2011	10
Wolfgang Petersen	1981	2006	7
Woody Allen	1977	2013	18
Zack Snyder	2004	2016	7
Zhang Yimou	2002	2014	6

199 rows × 3 columns

Notice,

- director_name column has turned into row labels
- There are multiple levels for the column names

This is called Multi-index Dataframe

- → What is Multi-index Dataframe?
 - It can have multiple indexes along a dimension
 - o no of dimensions remain same though => 2D
 - Multi-level indexes are possible both for rows and columns

data_agg.columns #Printing the columns for better clarity

The level-1 column names are year and title

What would happen if we print the col year of this multi-index dataframe?

```
data_agg["year"]
```

min max

dir	ect	tor	_na	ame

Adam McKay	2004	2015
Adam Shankman	2001	2012
Alejandro González Iñárritu	2000	2015
Alex Proyas	1994	2016
Alexander Payne	1999	2013
Wes Craven	1984	2011
Wolfgang Petersen	1981	2006
Woody Allen	1977	2013
Zack Snyder	2004	2016
Zhang Yimou	2002	2014

199 rows x 2 columns

→ How can we convert multi-level back to only one level of columns?

```
Example: year_min, year_max, title_count
```

year_min year_max title_count

director_	_name

2004	2015	6
2001	2012	8
2000	2015	6
1994	2016	5
1999	2013	5
1984	2011	10
1981	2006	7
1977	2013	18
2004	2016	7
2002	2014	6
	2001 2000 1994 1999 1984 1981 1977 2004	2001 2012 2000 2015 1994 2016 1999 2013 1984 2011 1981 2006 1977 2013 2004 2016

199 rows × 3 columns

Since these were tuples, we can just join them

```
# another more simplified method

data.groupby('director_name')[['year', 'title']].aggregate(
    year_max=('year','max'),
    year_min=('year','min'),
    title_count=('title','count')
```

year_max year_min title_count

director_name			
Adam McKay	2015	2004	6
Adam Shankman	2012	2001	8
Alejandro González Iñárritu	2015	2000	6
Alex Proyas	2016	1994	5
Alexander Payne	2013	1999	5
Wes Craven	2011	1984	10
Wolfgang Petersen	2006	1981	7
Woody Allen	2013	1977	18
Zack Snyder	2016	2004	7
Zhang Yimou	2014	2002	6

199 rows x 3 columns

Columns look good, but we may want to turn back the row labels into a proper column as well

converting row labels into a column using reset_index

data_agg.reset_index()

	director_name	year_min	year_max	title_count
0	Adam McKay	2004	2015	6
1	Adam Shankman	2001	2012	8
2	Alejandro González Iñárritu	2000	2015	6
3	Alex Proyas	1994	2016	5
4	Alexander Payne	1999	2013	5
194	Wes Craven	1984	2011	10
195	Wolfgang Petersen	1981	2006	7
196	Woody Allen	1977	2013	18
197	Zack Snyder	2004	2016	7
198	Zhang Yimou	2002	2014	6

199 rows × 4 columns

Using the new features, can we find the most productive director?

First calculate how many years the director has been active.

year_min year_max title_count yrs_active

director_name				
Adam McKay	2004	2015	6	11
Adam Shankman	2001	2012	8	11
Alejandro González Iñárritu	2000	2015	6	15
Alex Proyas	1994	2016	5	22
Alexander Payne	1999	2013	5	14
Wes Craven	1984	2011	10	27
Wolfgang Petersen	1981	2006	7	25
Woody Allen	1977	2013	18	36
Zack Snyder	2004	2016	7	12
Zhang Yimou	2002	2014	6	12

199 rows × 4 columns

Then calculate rate of directing movies by title_count/yrs_active

data_agg["movie_per_yr"] = data_agg["title_count"] / data_agg["yrs_active"]
data_agg

year_min year_max title_count yrs_active movie_per_yr director_name **Adam McKay** 2004 2015 0.545455 2012 0.727273 Adam Shankman 2001 8 11 Alejandro González Iñárritu 2000 2015 6 15 0.400000 **Alex Proyas** 1994 2016 5 22 0.227273 Alexander Payne 2013 5 0.357143 1999 14 Wes Craven 1984 10 27 0.370370 2011 7 **Wolfgang Petersen** 1981 2006 25 0.280000 Woody Allen 1977 2013 18 36 0.500000 7 Zack Snyder 2004 2016 12 0.583333 Zhang Yimou 2002 2014 6 12 0.500000

199 rows × 5 columns

Now finally sort the values

data_agg.sort_values("movie_per_yr", ascending=False)

year_min year_max title_count yrs_active movie_per_yr

director_name					
Tyler Perry	2006	2013	9	7	1.285714
Jason Friedberg	2006	2010	5	4	1.250000
Shawn Levy	2002	2014	11	12	0.916667
Robert Rodriguez	1992	2014	16	22	0.727273
Adam Shankman	2001	2012	8	11	0.727273
Lawrence Kasdan	1985	2012	5	27	0.185185
Luc Besson	1985	2014	5	29	0.172414
Robert Redford	1980	2010	5	30	0.166667
Sidney Lumet	1976	2006	5	30	0.166667
Michael Apted	1980	2010	5	30	0.166667

199 rows × 5 columns

Conclusion:

Tyler Perry turns out to be the truly most productive director

Importing our data

• For this topic we will be using data of few drugs being developed by PFizer

Link: https://drive.google.com/file/d/173A59xh2mnpmljCCB9bhC4C5eP2IS6qZ/view?usp=sharing

!gdown 173A59xh2mnpmljCCB9bhC4C5eP2IS6qZ

Downloading...

From: https://drive.google.com/uc?id=173A59xh2mnpmljCCB9bhC4C5eP2IS6qZ

To: /content/Pfizer_1.csv

100% 1.51k/1.51k [00:00<00:00, 8.41MB/s]

What is the data about?

- Temperature (K)
- Pressure (P)

are recorded after an interval of 1 hour everyday to monitor the drug stability in a drug development test

- ==> These data points are thus used to identify the optimal set of values of parameters for the stability of the drugs
- → Now, Let's explore this dataset

```
data = pd.read_csv('Pfizer_1.csv')
data
```

	Date	Drug_Name	Parameter	1:30:00	2:30:00	3:30:00	4:30:00	5:30:00	6:30:00	7:30:00	8:30:00	9:30:00
0	15-10-2020	diltiazem hydrochloride	Temperature	23.0	22.0	NaN	21.0	21.0	22	23.0	21.0	22.0
1	15-10-2020	diltiazem hydrochloride	Pressure	12.0	13.0	NaN	11.0	13.0	14	16.0	16.0	24.0
2	15-10-2020	docetaxel injection	Temperature	NaN	17.0	18.0	NaN	17.0	18	NaN	NaN	23.0
3	15-10-2020	docetaxel injection	Pressure	NaN	22.0	22.0	NaN	22.0	23	NaN	NaN	27.0
4	15-10-2020	ketamine hydrochloride	Temperature	24.0	NaN	NaN	27.0	NaN	26	25.0	24.0	23.0
5	15-10-2020	ketamine hydrochloride	Pressure	8.0	NaN	NaN	7.0	NaN	9	10.0	11.0	10.0
6	16-10-2020	diltiazem hydrochloride	Temperature	34.0	35.0	36.0	36.0	37.0	38	37.0	38.0	39.0
7	16-10-2020	diltiazem hydrochloride	Pressure	18.0	19.0	20.0	21.0	22.0	23	24.0	25.0	25.0
8	16-10-2020	docetaxel injection	Temperature	46.0	47.0	NaN	48.0	48.0	49	50.0	52.0	55.0
9	16-10-2020	docetaxel injection	Pressure	23.0	24.0	NaN	25.0	26.0	27	28.0	29.0	28.0
10	16-10-2020	ketamine hydrochloride	Temperature	8.0	9.0	10.0	NaN	11.0	12	12.0	11.0	NaN
11	16-10-2020	ketamine hydrochloride	Pressure	12.0	12.0	13.0	NaN	15.0	15	15.0	15.0	NaN
12	17-10-2020	diltiazem hydrochloride	Temperature	20.0	19.0	19.0	18.0	17.0	16	15.0	NaN	13.0
13	17-10-2020	diltiazem hydrochloride	Pressure	3.0	4.0	4.0	4.0	6.0	8	9.0	NaN	9.0
14	17-10-2020	docetaxel injection	Temperature	12.0	13.0	14.0	15.0	16.0	17	18.0	19.0	20.0
15	17-10-2020	docetaxel injection	Pressure	20.0	22.0	22.0	22.0	22.0	23	25.0	26.0	27.0
16	17-10-2020	ketamine hydrochloride	Temperature	13.0	14.0	15.0	16.0	17.0	18	19.0	20.0	21.0
17	17-10-2020	ketamine hydrochloride	Pressure	8.0	9.0	10.0	11.0	11.0	12	12.0	11.0	12.0

data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 18 entries, 0 to 17
Data columns (total 15 columns):

Data	columns (t	ota	l 15 columns	s):			
#	Column	ION	n-Null Count	t Dtype			
0	Date	18	non-null	object			
1	Drug_Name	18	non-null	object			
2	Parameter	18	non-null	object			
3	1:30:00	16	non-null	float64			
4	2:30:00	16	non-null	float64			
5	3:30:00	12	non-null	float64			
6	4:30:00	14	non-null	float64			
7	5:30:00	16	non-null	float64			
8	6:30:00	18	non-null	int64			
9	7:30:00	16	non-null	float64			
10	8:30:00	14	non-null	float64			
11	9:30:00	16	non-null	float64			
12	10:30:00	18	non-null	int64			
13	11:30:00	16	non-null	float64			
14	12:30:00	18	non-null	int64			
dtype	es: float64	(9)	, int64(3),	object(3)			
memo	memory usage: 2.2+ KB						

Melting in Pandas

As we saw earlier, the dataset has 18 rows and 15 columns

If you notice further, you'll see:

- The columns are 1:30:00, 2:30:00, 3:30:00, ... so on
- Temperature and Pressure of each date is in a separate row
- Can we restructure our data into a better format?

Maybe we can have a column for time, with timestamps as the column value

Where will the Temperature/Pressure values go?

We can similarly create one column containing the values of these parameters

==> "Melt" timestamp columns into two columns - timestamp and corresponding values

How can we restructure our data into having every row corresponding to a single reading?

pd.melt(data, id_vars=['Date', 'Parameter', 'Drug_Name'])

	Date	Parameter	Drug_Name	variable	value
0	15-10-2020	Temperature	diltiazem hydrochloride	1:30:00	23.0
1	15-10-2020	Pressure	diltiazem hydrochloride	1:30:00	12.0
2	15-10-2020	Temperature	docetaxel injection	1:30:00	NaN
3	15-10-2020	Pressure	docetaxel injection	1:30:00	NaN
4	15-10-2020	Temperature	ketamine hydrochloride	1:30:00	24.0
211	17-10-2020	Pressure	diltiazem hydrochloride	12:30:00	14.0
212	17-10-2020	Temperature	docetaxel injection	12:30:00	23.0
213	17-10-2020	Pressure	docetaxel injection	12:30:00	28.0
214	17-10-2020	Temperature	ketamine hydrochloride	12:30:00	24.0
215	17-10-2020	Pressure	ketamine hydrochloride	12:30:00	15.0

216 rows × 5 columns

This converts our data from wide to long format

Notice the id_vars are set of variables which remain unmelted

How does pd.melt() work?

- Pass in the DataFrame
- · Pass in the column names to not melt

But we can provide better names to these new columns

▼ How can we rename the columns "variable" and "value" as per our original dataframe?

data_melt

	Date	Drug_Name	Parameter	time	reading
0	15-10-2020	diltiazem hydrochloride	Temperature	1:30:00	23.0
1	15-10-2020	diltiazem hydrochloride	Pressure	1:30:00	12.0
2	15-10-2020	docetaxel injection	Temperature	1:30:00	NaN
3	15-10-2020	docetaxel injection	Pressure	1:30:00	NaN
4	15-10-2020	ketamine hydrochloride	Temperature	1:30:00	24.0
211	17-10-2020	diltiazem hydrochloride	Pressure	12:30:00	14.0
212	17-10-2020	docetaxel injection	Temperature	12:30:00	23.0
213	17-10-2020	docetaxel injection	Pressure	12:30:00	28.0
214	17-10-2020	ketamine hydrochloride	Temperature	12:30:00	24.0
215	17-10-2020	ketamine hydrochloride	Pressure	12:30:00	15.0

216 rows \times 5 columns

Conclusion

- The labels of the timestamp columns are conviniently melted into a single column time
- It retained all values in column reading
- $\bullet \ \ \, \text{The labels of columns such as } \ 1:30:00 \ , \ 2:30:00 \ \, \text{have now become categories of the variable column}$
- The ${\bf values}$ from ${\bf columns}$ we are ${\bf melting}$ are stored in ${\bf value}$ ${\bf column}$

Pivot

Now suppose we want to convert our data back to wide format

The reason could be to maintain the structure for storing or some other purpose.

Notice:

- The variables Date, Drug_Name and Parameter will remain same
- The column names will be extracted from the column time
- The values will be extracted from the column readings
- How can we restructure our data back to the original wide format, before it was melted?

		time	10:30:00	11:30:00	12:30:00	1:30:00	2:30:00	3:30:00	4:30:00	5:30:00	6:30:
Date	Drug_Name	Parameter									
15-10-2020	diltiazem hydrochloride	Pressure	18.0	19.0	20.0	12.0	13.0	NaN	11.0	13.0	14
		Temperature	20.0	20.0	21.0	23.0	22.0	NaN	21.0	21.0	22
	docetaxel injection	Pressure	26.0	29.0	28.0	NaN	22.0	22.0	NaN	22.0	23
		Temperature	23.0	25.0	25.0	NaN	17.0	18.0	NaN	17.0	18
	ketamine hydrochloride	Pressure	9.0	9.0	11.0	8.0	NaN	NaN	7.0	NaN	ξ
		Temperature	22.0	21.0	20.0	24.0	NaN	NaN	27.0	NaN	26
16-10-2020	diltiazem hydrochloride	Pressure	24.0	NaN	27.0	18.0	19.0	20.0	21.0	22.0	23
		Temperature	40.0	NaN	42.0	34.0	35.0	36.0	36.0	37.0	38
	docetaxel injection	Pressure	28.0	29.0	30.0	23.0	24.0	NaN	25.0	26.0	27
		Temperature	56.0	57.0	58.0	46.0	47.0	NaN	48.0	48.0	45
	ketamine hydrochloride	Pressure	16.0	17.0	18.0	12.0	12.0	13.0	NaN	15.0	15
		Temperature	13.0	14.0	15.0	8.0	9.0	10.0	NaN	11.0	12
17-10-2020	diltiazem hydrochloride	Pressure	11.0	13.0	14.0	3.0	4.0	4.0	4.0	6.0	8
		Temperature	14.0	11.0	10.0	20.0	19.0	19.0	18.0	17.0	16
	docetaxel injection	Pressure	28.0	29.0	28.0	20.0	22.0	22.0	22.0	22.0	23
		Temperature	21.0	22.0	23.0	12.0	13.0	14.0	15.0	16.0	17
	ketamine hydrochloride	Pressure	13.0	14.0	15.0	8.0	9.0	10.0	11.0	11.0	12
		Temperature	22.0	23.0	24.0	13.0	14.0	15.0	16.0	17.0	18

Notice,

pivot() is the exact opposite of melt

We are getting multiple indices here, but we can get single index again using $\textit{reset_index}$

time	Date	Drug_Name	Parameter	10:30:00	11:30:00	12:30:00	1:30:00	2:30:00	3:30:00	4:30:00	5:30:00	6:
0	15-10-2020	diltiazem hydrochloride	Pressure	18.0	19.0	20.0	12.0	13.0	NaN	11.0	13.0	
1	15-10-2020	diltiazem hydrochloride	Temperature	20.0	20.0	21.0	23.0	22.0	NaN	21.0	21.0	
2	15-10-2020	docetaxel injection	Pressure	26.0	29.0	28.0	NaN	22.0	22.0	NaN	22.0	
3	15-10-2020	docetaxel injection	Temperature	23.0	25.0	25.0	NaN	17.0	18.0	NaN	17.0	
4	15-10-2020	ketamine hydrochloride	Pressure	9.0	9.0	11.0	8.0	NaN	NaN	7.0	NaN	
5	15-10-2020	ketamine hydrochloride	Temperature	22.0	21.0	20.0	24.0	NaN	NaN	27.0	NaN	
6	16-10-2020	diltiazem hydrochloride	Pressure	24.0	NaN	27.0	18.0	19.0	20.0	21.0	22.0	
7	16-10-2020	diltiazem hydrochloride	Temperature	40.0	NaN	42.0	34.0	35.0	36.0	36.0	37.0	
8	16-10-2020	docetaxel injection	Pressure	28.0	29.0	30.0	23.0	24.0	NaN	25.0	26.0	
9	16-10-2020	docetaxel injection	Temperature	56.0	57.0	58.0	46.0	47.0	NaN	48.0	48.0	
10	16-10-2020	ketamine hydrochloride	Pressure	16.0	17.0	18.0	12.0	12.0	13.0	NaN	15.0	
11	16-10-2020	ketamine hydrochloride	Temperature	13.0	14.0	15.0	8.0	9.0	10.0	NaN	11.0	
12	17-10-2020	diltiazem hydrochloride	Pressure	11.0	13.0	14.0	3.0	4.0	4.0	4.0	6.0	
13	17-10-2020	diltiazem hydrochloride	Temperature	14.0	11.0	10.0	20.0	19.0	19.0	18.0	17.0	
14	17-10-2020	docetaxel injection	Pressure	28.0	29.0	28.0	20.0	22.0	22.0	22.0	22.0	
15	17-10-2020	docetaxel injection	Temperature	21.0	22.0	23.0	12.0	13.0	14.0	15.0	16.0	
16	17-10-2020	ketamine hydrochloride	Pressure	13.0	14.0	15.0	8.0	9.0	10.0	11.0	11.0	
17	17-10-2020	ketamine hydrochloride	Temperature	22.0	23.0	24.0	13.0	14.0	15.0	16.0	17.0	

data_melt.head()

	Date	Drug_Name	Parameter	time	reading
0	15-10-2020	diltiazem hydrochloride	Temperature	1:30:00	23.0
1	15-10-2020	diltiazem hydrochloride	Pressure	1:30:00	12.0
2	15-10-2020	docetaxel injection	Temperature	1:30:00	NaN
3	15-10-2020	docetaxel injection	Pressure	1:30:00	NaN
4	15-10-2020	ketamine hydrochloride	Temperature	1:30:00	24.0

Now if you notice,

We are **using 2 rows** to log readings for a single experiment.

▼ Can we further restructure our data into dividing the Parameter column into T/P?

A format like:

Date | time | Drug_Name | Pressure | Temperature would be really suitable

• We want to split one single column into multiple columns

How can we divide the Parameter column again?

data_tidy

		Parameter	Pressure	Temperature
Date	e time	Drug_Name		
15-10-2020	10:30:00	diltiazem hydrochloride	18.0	20.0
		docetaxel injection	26.0	23.0
		ketamine hydrochloride	9.0	22.0
	11:30:00	diltiazem hydrochloride	19.0	20.0
		docetavel injection	20 N	25 N

We can use $\mbox{reset_index()}$ to $\mbox{remove the multi-index}$

data_tidy = data_tidy.reset_index()
data_tidy

Parameter	Date	time	Drug_Name	Pressure	Temperature
0	15-10-2020	10:30:00	diltiazem hydrochloride	18.0	20.0
1	15-10-2020	10:30:00	docetaxel injection	26.0	23.0
2	15-10-2020	10:30:00	ketamine hydrochloride	9.0	22.0
3	15-10-2020	11:30:00	diltiazem hydrochloride	19.0	20.0
4	15-10-2020	11:30:00	docetaxel injection	29.0	25.0
103	17-10-2020	8:30:00	docetaxel injection	26.0	19.0
104	17-10-2020	8:30:00	ketamine hydrochloride	11.0	20.0
105	17-10-2020	9:30:00	diltiazem hydrochloride	9.0	13.0
106	17-10-2020	9:30:00	docetaxel injection	27.0	20.0
107	17-10-2020	9:30:00	ketamine hydrochloride	12.0	21.0

108 rows × 5 columns

We can rename our index column from Parameter to simply None

data_tidy.columns.name = None

data_tidy.head()

	Date	time	Drug_Name	Pressure	Temperature
0	15-10-2020	10:30:00	diltiazem hydrochloride	18.0	20.0
1	15-10-2020	10:30:00	docetaxel injection	26.0	23.0
2	15-10-2020	10:30:00	ketamine hydrochloride	9.0	22.0
3	15-10-2020	11:30:00	diltiazem hydrochloride	19.0	20.0
4	15-10-2020	11:30:00	docetaxel injection	29.0	25.0

Pivot Table

Now suppose we want to find some insights, like mean temperature day wise

Can we use pivot to find the day-wise mean value of temperature for each drug?