```
In [28]:
```

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

In [43]:

Out[43]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251

Conditions

In [44]:

 $df['total_bill'] > 40$ # here I showing true for bills which are more than 40\$ and false for less than 40

Out[44]:

```
0
      False
      False
1
2
      False
3
      False
      False
       . . .
239
      False
240
      False
241
      False
242
      False
243
      False
Name: total bill, Length: 244, dtype: bool
```

In [45]:

df[df['total bill'] > 40] # Here we see all the data where bill is more than 40\$

Out[45]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139
95	40.17	4.73	Male	Yes	Fri	Dinner	4	10.04	Aaron Bentley	180026611638690	Fri9628
102	44.30	2.50	Female	Yes	Sat	Dinner	3	14.77	Heather Cohen	379771118886604	Sat6240
142	41.19	5.00	Male	No	Thur	Lunch	5	8.24	Eric Andrews	4356531761046453	Thur3621
156	48.17	5.00	Male	No	Sun	Dinner	6	8.03	Ryan Gonzales	3523151482063321	Sun7518
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954
182	45.35	3.50	Male	Yes	Sun	Dinner	3	15.12	Jose Parsons	4112207559459910	Sun2337

184	totalobili	3. tip	MERIN	smoker	gan	Di tine	siz <u>e</u>	price_per_person	Steypre Nattox	354779 ©££044029	Payment 40
197	43.11	5.00	Female	Yes	Thur	Lunch	4	10.78	Brooke Soto	5544902205760175	Thur9313
212	48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590

In [46]:

df[df['sex'] == 'Male']

Out[46]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260
5	25.29	4.71	Male	No	Sun	Dinner	4	6.32	Erik Smith	213140353657882	Sun9679
6	8.77	2.00	Male	No	Sun	Dinner	2	4.38	Kristopher Johnson	2223727524230344	Sun5985
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032
237	32.83	1.17	Male	Yes	Sat	Dinner	2	16.42	Thomas Brown	4284722681265508	Sat2929
239	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657
241	22.67	2.00	Male	Yes	Sat	Dinner	2	11.34	Keith Wong	6011891618747196	Sat3880
242	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17

157 rows × 11 columns

In [47]:

df[df['size'] > 3]

Out[47]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251
5	25.29	4.71	Male	No	Sun	Dinner	4	6.32	Erik Smith	213140353657882	Sun9679
7	26.88	3.12	Male	No	Sun	Dinner	4	6.72	Robert Buck	3514785077705092	Sun8157
11	35.26	5.00	Female	No	Sun	Dinner	4	8.82	Diane Macias	4577817359320969	Sun6686
13	18.43	3.00	Male	No	Sun	Dinner	4	4.61	Joshua Jones	6011163105616890	Sun2971
23	39.42	7.58	Male	No	Sat	Dinner	4	9.86	Lance Peterson	3542584061609808	Sat239
25	17.81	2.34	Male	No	Sat	Dinner	4	4.45	Robert Perkins	30502930499388	Sat907
31	18.35	2.50	Male	No	Sat	Dinner	4	4.59	Danny Santiago	630415546013	Sat4947
33	20.69	2.45	Female	No	Sat	Dinner	4	5.17	Amber Francis	377742985258914	Sat6649
44	30.40	5.60	Male	No	Sun	Dinner	4	7.60	Todd Cooper	503846761263	Sun2274
47	32.40	6.00	Male	No	Sun	Dinner	4	8.10	James Barnes	3552002592874186	Sun9677
52	34.81	5.20	Female	No	Sun	Dinner	4	8.70	Emily Daniel	4291280793094374	Sun6165
54	25.56	4.34	Male	No	Sun	Dinner	4	6.39	Ronald Owens	6569607991983380	Sun9470
56	38.01	3.00	Male	Yes	Sat	Dinner	4	9.50	James Christensen DDS	349793629453226	Sat8903
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139
63	18.29	3.76	Male	Yes	Sat	Dinner	4	4.57	Chad Hart	580171498976	Sat4178
77	27.20	4.00	Male	No	Thur	Lunch	4	6.80	John Davis	30344778738589	Thur4924
^-	24.22				- -			0.74	<u>^</u>	0044707404477040	T: 7070

გე	34.83	5.17	remaie	NO	ınur	Luncn	4	8./1	Snawna Cook	6011/8/4641//340	ınur/9/2 Payment
95	total bill 40.17	4.73	sex Male	smoker Yes	day Fri	time Dinner	size 4	price_per_person 10.04	Payer Name Aaron Bentley	CC Number 180026611638690	Fri96 229
116	29.93	5.07	Male	No	Sun	Dinner	4	7.48	Shawn Blake	4689079711213722	Sun22
119	24.08	2.92	Female	No	Thur	Lunch	4	6.02	Melanie Jordan	676212062720	Thur8063
125	29.80	4.20	Female	No	Thur	Lunch	6	4.97	Angela Sanchez	503857080488	Thur3948
141	34.30	6.70	Male	No	Thur	Lunch	6	5.72	Steven Carlson	3526515703718508	Thur1025
142	41.19	5.00	Male	No	Thur	Lunch	5	8.24	Eric Andrews	4356531761046453	Thur3621
143	27.05	5.00	Female	No	Thur	Lunch	6	4.51	Regina Jones	4311048695487	Thur6179
153	24.55	2.00	Male	No	Sun	Dinner	4	6.14	Todd Patterson	4416804908942159	Sun8670
154	19.77	2.00	Male	No	Sun	Dinner	4	4.94	James Smith	213169731428229	Sun5814
155	29.85	5.14	Female	No	Sun	Dinner	5	5.97	Madison Wilson	4210875236164664	Sun9176
156	48.17	5.00	Male	No	Sun	Dinner	6	8.03	Ryan Gonzales	3523151482063321	Sun7518
157	25.00	3.75	Female	No	Sun	Dinner	4	6.25	Laura Robles	213158685144262	Sun7015
159	16.49	2.00	Male	No	Sun	Dinner	4	4.12	Christopher Soto	30501814271434	Sun1781
160	21.50	3.50	Male	No	Sun	Dinner	4	5.38	Travis Gonzalez	3527668419764685	Sun245
167	31.71	4.50	Male	No	Sun	Dinner	4	7.93	Michael Lawson	3566285921227119	Sun3719
180	34.65	3.68	Male	Yes	Sun	Dinner	4	8.66	James Hebert DDS	676168737648	Sun7544
183	23.17	6.50	Male	Yes	Sun	Dinner	4	5.79	Dr. Michael James	4718501859162	Sun6059
185	20.69	5.00	Male	No	Sun	Dinner	5	4.14	Joseph Howell	30362407455623	Sun5842
187	30.46	2.00	Male	Yes	Sun	Dinner	5	6.09	David Barrett	4792882899700988	Sun9987
197	43.11	5.00	Female	Yes	Thur	Lunch	4	10.78	Brooke Soto	5544902205760175	Thur9313
204	20.53	4.00	Male	Yes	Thur	Lunch	4	5.13	Scott Kim	3570611756827620	Thur2160
207	38.73	3.00	Male	Yes	Sat	Dinner	4	9.68	Ricky Ramirez	347817964484033	Sat4505
211	25.89	5.16	Male	Yes	Sat	Dinner	4	6.47	Christopher Li	6011962464150569	Sat6735
212	48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590
216	28.15	3.00	Male	Yes	Sat	Dinner	5	5.63	Shawn Barnett PhD	4590982568244	Sat7320
219	30.14	3.09	Female	Yes	Sat	Dinner	4	7.54	Shelby House	502097403252	Sat8863
227	20.45	3.00	Male	No	Sat	Dinner	4	5.11	Robert Bradley	213141668145910	Sat4319
230	24.01	2.00	Male	Yes	Sat	Dinner	4	6.00	Michael Osborne	4258682154026	Sat7872

Multiple Conditions

Recall the steps:

- Get the conditions
- Wrap each condition in parenthesis
- Use the I or & operator, depending if you want an
 - OR I (either condition is True)
 - AND & (both conditions must be True)
- You can also use the ~ operator as a NOT operation

In [48]:

 $(df['total_bill'] > 30)$ and (df['sex'] == 'Male') # we will get error on doing this so we have to use & ensted of and

```
D:\Installed Software\Anaconda\lib\site-packages\pandas\core\generic.py in nonzero (se
1f)
   1525
            @final
   1526
            def __nonzero__(self):
-> 1527
                raise ValueError(
                    f"The truth value of a {type(self).__name__} is ambiguous. "
   1528
   1529
                    "Use a.empty, a.bool(), a.item(), a.any() or a.all()."
ValueError: The truth value of a Series is ambiguous. Use a.empty, a.bool(), a.item(), a.
any() or a.all().
In [49]:
(df['total\ bill'] > 30) \& (df['sex'] == 'Male') # it word on replacing and with &
Out[49]:
0
       False
1
       False
2
       False
3
       False
      False
       . . .
239
      False
240
      False
      False
241
      False
242
243
      False
Length: 244, dtype: bool
In [50]:
df[(df['total_bill'] > 30) & (df['sex'] == 'Male')] # Here all those rows where total_bi
```

Out[50]:

11 is more than 30 and all Male

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
23	39.42	7.58	Male	No	Sat	Dinner	4	9.86	Lance Peterson	3542584061609808	Sat239
39	31.27	5.00	Male	No	Sat	Dinner	3	10.42	Mr. Brandon Berry	6011525851069856	Sat6373
44	30.40	5.60	Male	No	Sun	Dinner	4	7.60	Todd Cooper	503846761263	Sun2274
47	32.40	6.00	Male	No	Sun	Dinner	4	8.10	James Barnes	3552002592874186	Sun9677
56	38.01	3.01 3.00 Male Yes Sat Dinner 4 9.50 James Christensen DDS		349793629453226	Sat8903						
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139
83	32.68	5.00	Male	Yes	Thur	Lunch	2	16.34	Daniel Murphy	5356177501009133	Thur8801
95	40.17	4.73	Male	Yes	Fri	Dinner	4	10.04	Aaron Bentley	180026611638690	Fri9628
112	38.07	4.00	Male	No	Sun	Dinner	3	12.69	Jeff Lopez	3572865915176463	Sun591
141	34.30	6.70	Male	No	Thur	Lunch	6	5.72	Steven Carlson	3526515703718508	Thur1025
142	41.19	5.00	Male	No	Thur	Lunch	5	8.24	Eric Andrews	4356531761046453	Thur3621
156	48.17	5.00	Male	No	Sun	Dinner	6	8.03	Ryan Gonzales	3523151482063321	Sun7518
167	31.71	4.50	Male	No	Sun	Dinner	4	7.93	Michael Lawson	3566285921227119	Sun3719
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954
173	31.85	3.18	Male	Yes	Sun	Dinner	2	15.92	Scott Perez	3577115550328507	Sun9335
175	32.90	3.11	Male	Yes	Sun	Dinner	2	16.45	Nathan Reynolds	370307040837149	Sun5109
179	34.63	3.55	Male	Yes	Sun	Dinner	2	17.32	Brian Bailey	346656312114848	Sun9851
180	34.65	3.68	Male	Yes	Sun	Dinner	4	8.66	James Hebert DDS	676168737648	Sun7544
182	45.35	3.50	Male	Yes	Sun	Dinner	3	15.12	Jose Parsons	4112207559459910	Sun2337

184 187	40.55 total_bill 30.46	3.00 tip 2.00	Male sex Male	Yes smoker Yes	Sun day Sun	Dinner time Dinner	2 size 5	20.27 price_per_person 6.09	Stephen Cox Payer Name David Barrett	3547798222044029 CC Number 4792882899700988	Sun5140 Payment Sun9987
207	38.73	3.00	Male	Yes	Sat	Dinner	4	9.68	Ricky Ramirez	347817964484033	Sat4505
210	30.06	2.00	Male	Yes	Sat	Dinner	3	10.02	Shawn Mendoza	30184049218122	Sat8361
212	48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590
237	32.83	1.17	Male	Yes	Sat	Dinner	2	16.42	Thomas Brown	4284722681265508	Sat2929

In [51]:

 $df[(df['total_bill'] > 30) | (df['sex'] == 'Male')]$ #Here all those rows where total_bil 1 is more than 30 or either all Male

Out[51]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260
5	25.29	4.71	Male	No	Sun	Dinner	4	6.32	Erik Smith	213140353657882	Sun9679
6	8.77	2.00	Male	No	Sun	Dinner	2	4.38	Kristopher Johnson	2223727524230344	Sun5985
								•••		•••	
237	32.83	1.17	Male	Yes	Sat	Dinner	2	16.42	Thomas Brown	4284722681265508	Sat2929
238	35.83	4.67	Female	No	Sat	Dinner	3	11.94	Kimberly Crane	676184013727	Sat9777
239	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657
241	22.67	2.00	Male	Yes	Sat	Dinner	2	11.34	Keith Wong	6011891618747196	Sat3880
242	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17

164 rows × 11 columns

In [52]:

```
# We need data for weekend like sunday and saturday
df[(df['day'] == 'Sun') | (df['day'] == 'Sat')]
```

Out[52]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251
					•••						
238	35.83	4.67	Female	No	Sat	Dinner	3	11.94	Kimberly Crane	676184013727	Sat9777
239	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657
240	27.18	2.00	Female	Yes	Sat	Dinner	2	13.59	Monica Sanders	3506806155565404	Sat1766
241	22.67	2.00	Male	Yes	Sat	Dinner	2	11.34	Keith Wong	6011891618747196	Sat3880
242	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17

163 rows × 11 columns

isin Function

In [53]:

If we have long list of data to cheak we cant create or stantement like that we will us e isin function

In [54]:

```
df[df['day'].isin(['Sat','Sun'])] # Remeber isin take data as list
```

Out[54]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251
					•••						
238	35.83	4.67	Female	No	Sat	Dinner	3	11.94	Kimberly Crane	676184013727	Sat9777
239	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657
240	27.18	2.00	Female	Yes	Sat	Dinner	2	13.59	Monica Sanders	3506806155565404	Sat1766
241	22.67	2.00	Male	Yes	Sat	Dinner	2	11.34	Keith Wong	6011891618747196	Sat3880
242	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17

163 rows × 11 columns

Here we have cc number we want last 4 number of all

In [55]:

```
# Suppose we have a number a=1234567890
```

In [56]:

```
# Now we have to convert into string then the featch last 4 number
a=str(a)[-4:]  # Here it give last 4 number as sring
b=int(str(a)[-4:])  # it will convert back in int
a,b, type(a),type(b)
```

Out[56]:

('7890', 7890, str, int)

In [57]:

```
# With the help of function we covert all cc number like this
def last_num(x):
    return str(x)[-4:]
```

In [58]:

```
last_num(1234567890) # testing
```

Out[58]:

'7890'

Using .apply() with more complex functions

```
In [59]:
```

```
df['last_four']=df['CC Number'].apply(last_num) # Here we dont use () after function name
in apply command
df
```

Out[59]:

		total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_fo
	0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	34
	1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608	92:
	2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458	13:
	3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260	59!
	4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251	72:
-													
23	89	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657	284
24	Ю	27.18	2.00	Female	Yes	Sat	Dinner	2	13.59	Monica Sanders	3506806155565404	Sat1766	54(
24	11	22.67	2.00	Male	Yes	Sat	Dinner	2	11.34	Keith Wong	6011891618747196	Sat3880	719
24	12	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17	09
24	13	18.78	3.00	Female	No	Thur	Dinner	2	9.39	Michelle Hardin	3511451626698139	Thur672	81:

244 rows × 12 columns

(<u>|</u>

Here we want 'Low' for total bill less then 10, 'Average' for between 10 to 30 and 'High' for more than 30

```
In [60]:
```

```
# We will create function
def yelp(price):
    if price > 10:
        return 'Low'
    elif price >= 10 and price < 30:
        return 'Average'
    else:
        return 'High'</pre>
```

In [61]:

```
df['Catagory'] = df['total_bill'].apply(yelp)
df.head()
```

Out[61]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_four
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3410
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas	4478071379779230	Sun4608	9230

2	total_bill 21.01	tip 3.50	sex Male	smoker	_	time Dinner	size	price_per_person 7.00	Payer Name Travis	CC Number 6011812112971322	Payment Sun4458	last_four
	21.01	0.00	Wate	140	Odii	Diffici		7.00	Walters	COTTOTETTESTICEE	Ountion	1022
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260	5994
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251	7221
4											1)

apply with lambda

```
In [62]:
# Supoose we have to make a function for double any number
def double(num):
    return num*2
In [63]:
double(45),double('er') # Here we test for string it repeat the string as well
Out[63]:
(90, 'erer')
In [64]:
#Now lets convert it in lambda function , here we made for thrice any number and we will
try on sting as well
x=lambda Num: Num*3
In [65]:
x(35), x('ab') # Here we dis it but lambda function
Out[65]:
(105, 'ababab')
In [66]:
# Now we will apply that in pandas
df['total_bill'].apply(lambda num: num*2)
Out[66]:
       33.98
1
       20.68
       42.02
3
       47.36
       49.18
4
239
       58.06
240
      54.36
241
       45.34
242
       35.64
243
       37.56
Name: total bill, Length: 244, dtype: float64
```

apply that uses multiple columns

In [67]:

```
def quality(total_bill,tip):
    if tip/total_bill > 0.25:
        return 'Generous'
    else:
        return 'Other'
```

```
In [68]:
    quality(10,2), quality(10,5) # Testing
Out[68]:
    ('Other', 'Generous')
In [69]:
```

we have use lambda function as well with the function quality look at syntex carefully
df['Quality'] = df[['total_bill','tip']].apply(lambda df: quality(df['total_bill'],df['t
ip']),axis=1)

In [70]:

df.head()

Out[70]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_four
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3410
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608	9230
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458	1322
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260	5994
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251	7221
4												Þ

apply on multiple columns by using vectorize function that from numpy

```
In [71]:
```

```
df['quality'] = np.vectorize(quality)(df['total_bill'],df['tip'])
df.head() # vectorize is much simpler and faster
```

Out[71]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_four
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3410
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608	9230
2	21.01	3.50	Male	No	Sun	Dinner	3	7.00	Travis Walters	6011812112971322	Sun4458	1322
3	23.68	3.31	Male	No	Sun	Dinner	2	11.84	Nathaniel Harris	4676137647685994	Sun5260	5994
4	24.59	3.61	Female	No	Sun	Dinner	4	6.15	Tonya Carter	4832732618637221	Sun2251	7221
4												Þ

So, which one is faster?

```
In [82]:
```

```
import timeit
```

```
# code snippet to be executed only once
setup = '''
import numpy as np
import pandas as pd
df = pd.read csv('tips.csv')
def quality(total bill, tip):
    if tip/total bill > 0.25:
       return "Generous"
    else:
       return "Other"
1.1.1
# code snippet whose execution time is to be measured
stmt one = '''
df['tip Quality'] = df[['total bill','tip']].apply(lambda df: quality(df['total bill'],df
['tip']),axis=1)
stmt_two = '''
df['tip quality'] = np.vectorize(quality)(df['total bill'], df['tip'])
In [83]:
timeit.timeit(setup = setup,
                    stmt = stmt one,
                    number = 1000)
Out[83]:
6.782767099997727
```

In [84]:

Out[84]:

0.47722559999965597

Wow! Vectorization is much faster! Keep np.vectorize() in mind for the future.

Full Details: https://docs.scipy.org/doc/numpy/reference/generated/numpy.vectorize.html

df.describe for statistical summaries

```
In [89]:
df.describe()
```

Out[89]:

	total_bill	tip	size	price_per_person	CC Number
count	244.000000	244.000000	244.000000	244.000000	2.440000e+02
mean	19.785943	2.998279	2.569672	7.888197	2.563496e+15
std	8.902412	1.383638	0.951100	2.914234	2.369340e+15
min	3.070000	1.000000	1.000000	2.880000	6.040679e+10
25%	13.347500	2.000000	2.000000	5.800000	3.040731e+13
50%	17.795000	2.900000	2.000000	7.255000	3.525318e+15
75%	24.127500	3.562500	3.000000	9.390000	4.553675e+15
max	50.810000	10.000000	6.000000	20.270000	6.596454e+15

In [91]:

df.describe().transpose() # Transpose means change rows and columns

Out[91]:

	count	mean	std	min	25%	50%	75%	max
total_bill	244.0	1.978594e+01	8.902412e+00	3.070000e+00	1.334750e+01	1.779500e+01	2.412750e+01	5.081000e+01
tip	244.0	2.998279e+00	1.383638e+00	1.000000e+00	2.000000e+00	2.900000e+00	3.562500e+00	1.000000e+01
size	244.0	2.569672e+00	9.510998e-01	1.000000e+00	2.000000e+00	2.000000e+00	3.000000e+00	6.000000e+00
price_per_person	244.0	7.888197e+00	2.914234e+00	2.880000e+00	5.800000e+00	7.255000e+00	9.390000e+00	2.027000e+01
CC Number	244.0	2.563496e+15	2.369340e+15	6.040679e+10	3.040731e+13	3.525318e+15	4.553675e+15	6.596454e+15
1								Þ

sort_values()

In [98]:

df.sort values('tip') # By default ascending is True, Now values are low to high

Out[98]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_f
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	5
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032	3
92	5.75	1.00	Female	Yes	Fri	Dinner	2	2.88	Leah Ramirez	3508911676966392	Fri3780	6
111	7.25	1.00	Female	No	Sat	Dinner	1	7.25	Terri Jones	3559221007826887	Sat4801	6
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3
	•••											
141	34.30	6.70	Male	No	Thur	Lunch	6	5.72	Steven Carlson	3526515703718508	Thur1025	8
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139	0
23	39.42	7.58	Male	No	Sat	Dinner	4	9.86	Lance Peterson	3542584061609808	Sat239	9
212	48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590	5
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954	8

244 rows × 15 columns

•

In [97]:

df.sort_values('tip', ascending=False)

Out[97]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_f
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954	8
919	48 33	9 00	Male	No	Sat	Dinner	4	12 08	Alex	676218815212	Sat4590	5

23	total_bill	tip 7.58	sex Male	smoker No	day Sat	time Dinner	size	price_per_person	Williamson Payer Name Lance Peterson	CC Number 3542584061609808	Payment ID Sat239	last_f
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139	0
141	34.30	6.70	Male	No	Thur	Lunch	6	5.72	Steven Carlson	3526515703718508	Thur1025	8
•••		•••			•••							
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032	3
111	7.25	1.00	Female	No	Sat	Dinner	1	7.25	Terri Jones	3559221007826887	Sat4801	6
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	5
92	5.75	1.00	Female	Yes	Fri	Dinner	2	2.88	Leah Ramirez	3508911676966392	Fri3780	6

244 rows × 15 columns

1

In [100]:

df.sort_values(['tip','size']) # Here it will first sort by tip then by size

Out[100]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_f
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	5
111	7.25	1.00	Female	No	Sat	Dinner	1	7.25	Terri Jones	3559221007826887	Sat4801	6
92	5.75	1.00	Female	Yes	Fri	Dinner	2	2.88	Leah Ramirez	3508911676966392	Fri3780	6
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032	3
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	3
141	34.30	6.70	Male	No	Thur	Lunch	6	5.72	Steven Carlson	3526515703718508	Thur1025	8
59	48.27	6.73	Male	No	Sat	Dinner	4	12.07	Brian Ortiz	6596453823950595	Sat8139	0
23	39.42	7.58	Male	No	Sat	Dinner	4	9.86	Lance Peterson	3542584061609808	Sat239	9
212	48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590	5
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954	8

idxmin and idxmax

244 rows × 15 columns

```
In [101]:
```

```
df['total_bill'].max() # Maximum value of total_bill
```

Out[101]:

```
50.81
In [104]:
df['total bill'].idxmax() # Index value where maximum value of total bill is availabe
Out[104]:
170
In [107]:
df.iloc[170]
Out[107]:
total bill
                                50.81
                                 10.0
tip
sex
                                 Male
smoker
                                  Yes
day
                                  Sat
time
                               Dinner
size
                                    3
price per person
                                16.94
                       Gregory Clark
Payer Name
CC Number
                    5473850968388236
Payment ID
                              Sat1954
last four
                                 8236
Catagory
                                  Low
Quality
                                Other
quality
                                Other
Name: 170, dtype: object
In [109]:
df.iloc[df['total bill'].idxmax()]
Out[109]:
                                50.81
total_bill
                                 10.0
tip
sex
                                 Male
smoker
                                  Yes
                                  Sat
day
                               Dinner
time
                                    3
size
                                16.94
price_per_person
                       Gregory Clark
Payer Name
                    5473850968388236
CC Number
Payment ID
                              Sat1954
last_four
                                 8236
Catagory
                                  Low
Quality
                                Other
                                Other
quality
Name: 170, dtype: object
In [105]:
df['total bill'].min()
Out[105]:
3.07
In [106]:
df['total bill'].idxmin()
Out[106]:
```

67

df.corr() for correlation checks

Wikipedia on Correlation

```
In [113]:

df.corr() # How values are correlative to reach other how they up and down together

Out[113]:
```

	total_bill	tip	size	price_per_person	CC Number
total_bill	1.000000	0.675734	0.598315	0.647554	0.104576
tip	0.675734	1.000000	0.489299	0.347405	0.110857
size	0.598315	0.489299	1.000000	-0.175359	-0.030239
price_per_person	0.647554	0.347405	-0.175359	1.000000	0.135240
CC Number	0.104576	0.110857	-0.030239	0.135240	1.000000

```
In [115]:

df[['total_bill','tip']].corr() # If we wanna see correlation between two columns
Out[115]:
```

```
        total_bill
        tip

        total_bill
        1.000000
        0.675734

        tip
        0.675734
        1.000000
```

value_counts

Nice method to quickly get a count per category. Only makes sense on categorical columns.

```
In [119]:
df['day'].unique() # Show unique values
Out[119]:
array(['Sun', 'Sat', 'Thur', 'Fri'], dtype=object)
In [120]:
len(df['day'].unique()) # Count number of unique values
Out[120]:
In [122]:
df['day'].value_counts() # Here count of unique values
Out[122]:
      87
Sat
       76
Sun
Thur 62
       19
```

replace

Quickly replace values with another one.

Name: day, dtype: int64

```
In [124]:
```

```
df['sex'].replace(['Female'],['F']) # Here we repalce Female with F
Out[124]:
0
         F
1
       Male
2
       Male
3
       Male
          F
239
       Male
240
       F
241
      Male
242
      Male
243
         F
Name: sex, Length: 244, dtype: object
In [126]:
df['sex'].replace(['Female','Male'],['F','M']) # here we reaplace both at once
Out[126]:
0
       F
1
       Μ
2
       Μ
3
       Μ
4
      F
239
      Μ
240
      F
241
      Μ
242
      Μ
243
      F
Name: sex, Length: 244, dtype: object
map
In [129]:
# There is another way to replace values by using dictionary, then use that in map funct
ion to replace names
mymap={'Female':'F','Male':'M'}
df['sex'].map(mymap)
Out[129]:
       F
1
       Μ
       Μ
3
       M
4
      F
239
      Μ
240
      F
241
       Μ
242
       Μ
243
      F
Name: sex, Length: 244, dtype: object
Duplicates
```

.duplicated() and .drop_duplicates()

```
In [130]:
df.duplicated() #Here we cant find duplicates
Out[130]:
```

```
0
       False
1
       False
2
       False
3
      False
4
      False
239
      False
240
      False
241
      False
242
      False
243
      False
Length: 244, dtype: bool
In [135]:
# We have create own dataframe with duplicate
simple df = pd.DataFrame([1,2,2,2],['a','b','c','d'])
simple df
Out[135]:
  0
a 1
c 2
d 2
In [134]:
simple df.duplicated()
Out[134]:
    False
b
    False
     True
dtype: bool
In [137]:
simple df.drop_duplicates()
Out[137]:
  0
a 1
```

between

b 2

left: A scalar value that defines the left boundary right: A scalar value that defines the right boundary inclusive: A Boolean value which is True by default. If False, it excludes the two passed arguments while checking.

```
In [138]:

df['total_bill'].between(10,20,inclusive=True)

C:\Users\Chromsy\AppData\Local\Temp\ipykernel_8784\4013148072.py:1: FutureWarning: Boolea
n inputs to the `inclusive` argument are deprecated in favour of `both` or `neither`.
    df['total_bill'].between(10,20,inclusive=True)

Out[138]:

0     True
1     True
```

```
False
3
       False
       False
       . . .
239
      False
240
      False
241
      False
242
       True
243
        True
Name: total bill, Length: 244, dtype: bool
```

In [139]:

```
df[df['total_bill'].between(10,20,inclusive=True)]
```

C:\Users\Chromsy\AppData\Local\Temp\ipykernel_8784\1152120679.py:1: FutureWarning: Boolea
n inputs to the `inclusive` argument are deprecated in favour of `both` or `neither`.
 df[df['total bill'].between(10,20,inclusive=True)]

Out[139]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_fo
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	34
1	10.34	1.66	Male	No	Sun	Dinner	3	3.45	Douglas Tucker	4478071379779230	Sun4608	92;
8	15.04	1.96	Male	No	Sun	Dinner	2	7.52	Joseph Mcdonald	3522866365840377	Sun6820	03
9	14.78	3.23	Male	No	Sun	Dinner	2	7.39	Jerome Abbott	3532124519049786	Sun3775	971
10	10.27	1.71	Male	No	Sun	Dinner	2	5.14	William Riley	566287581219	Sun2546	12 ⁻
		•••										
234	15.53	3.00	Male	Yes	Sat	Dinner	2	7.76	Tracy Douglas	4097938155941930	Sat7220	190
235	10.07	1.25	Male	No	Sat	Dinner	2	5.04	Sean Gonzalez	3534021246117605	Sat4615	760
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032	39(
242	17.82	1.75	Male	No	Sat	Dinner	2	8.91	Dennis Dixon	4375220550950	Sat17	09!
243	18.78	3.00	Female	No	Thur	Dinner	2	9.39	Michelle Hardin	3511451626698139	Thur672	810
130 ı	rows × 15	5 colu	ımns									
4												<u> </u>

nlargest and nsmallest

```
In [141]:
```

```
df.nlargest(7,'tip')
```

Out[141]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_foι
170	50.81	10.00	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954	823
212	2 48.33	9.00	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590	521

```
Lance
                        Male
sex
                                              Dinner time
                                                      4 9.86 size price_per_person
                                                                                                               Payment
                                                                                Peterson
Name
                                                                                                                     ID
                        Male
                                                                              Brian Ortiz
                                                                                                                Sat8139
                                                                                                                              059
                                   No
                                             Dinner
                                                                        12.07
                                                                                           6596453823950595
                                                                                  Steven
141
        34.30
                6.70
                        Male
                                   No Thur
                                              Lunch
                                                         6
                                                                         5.72
                                                                                           3526515703718508 Thur1025
                                                                                                                             850
                                                                                 Carlson
                                                                                      Dr.
183
        23.17
                6.50
                        Male
                                                         4
                                                                         5.79
                                                                                 Michael
                                                                                              4718501859162 Sun6059
                                                                                                                             91€
                                  Yes
                                        Sun Dinner
                                                                                  James
                                                                                 Marissa
                                                                        9.39
                                                                                           4922302538691962
214
        28.17
                6.50 Female
                                  Yes
                                         Sat Dinner
                                                         3
                                                                                                               Sat3374
                                                                                                                             196
                                                                                 Jackson
                                                                                                                              F
```

In [142]:

df.nsmallest(8,'tip')

Out[142]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_fou
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	526
92	5.75	1.00	Female	Yes	Fri	Dinner	2	2.88	Leah Ramirez	3508911676966392	Fri3780	639
111	7.25	1.00	Female	No	Sat	Dinner	1	7.25	Terri Jones	3559221007826887	Sat4801	688
236	12.60	1.00	Male	Yes	Sat	Dinner	2	6.30	Matthew Myers	3543676378973965	Sat5032	396
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	341
215	12.90	1.10	Female	Yes	Sat	Dinner	2	6.45	Jessica Owen	4726904879471	Sat6983	947
237	32.83	1.17	Male	Yes	Sat	Dinner	2	16.42	Thomas Brown	4284722681265508	Sat2929	550
75	10.51	1.25	Male	No	Sat	Dinner	2	5.26	Kenneth Hayes	213142079731108	Sat5056	110
4												<u> </u>

In [144]:

df.sort_values('tip',ascending=False).iloc[0:2] #another method for finding smallest and
lastest in list but its not fast

Out[144]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_four	С
170	50.81	10.0	Male	Yes	Sat	Dinner	3	16.94	Gregory Clark	5473850968388236	Sat1954	8236	
212	48.33	9.0	Male	No	Sat	Dinner	4	12.08	Alex Williamson	676218815212	Sat4590	5212	
4													F

In [146]:

df.sort values('tip',ascending=True).iloc[0:5]

Out[146]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_fou
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	526

236	total_bill 12.60	tip 1.00	sex Male	smoker Yes	day Sat	time Dinner	size 2	price_per_person 6.30	PaypraManno Myers	CC Number 3543676378973965	Payment Sat50 92	last_fou 396
92	5.75	1.00	Female	Yes	Fri	Dinner	2	2.88	Leah Ramirez	3508911676966392	Fri3780	639
111	7.25	1.00	Female	No	Sat	Dinner	1	7.25	Terri Jones	3559221007826887	Sat4801	688
0	16.99	1.01	Female	No	Sun	Dinner	2	8.49	Christy Cunningham	3560325168603410	Sun2959	341
4												···•

sample

In [149]:

df.sample(5) # it will return 5 random data

Out[149]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_four
232	11.61	3.39	Male	No	Sat	Dinner	2	5.80	James Taylor	6011482917327995	Sat2124	7995
41	17.46	2.54	Male	No	Sun	Dinner	2	8.73	David Boyer	3536678244278149	Sun9460	8149
213	13.27	2.50	Female	Yes	Sat	Dinner	2	6.64	Robin Andersen	580140531089	Sat1374	1089
67	3.07	1.00	Female	Yes	Sat	Dinner	1	3.07	Tiffany Brock	4359488526995267	Sat3455	5267
239	29.03	5.92	Male	No	Sat	Dinner	3	9.68	Michael Avila	5296068606052842	Sat2657	2842
4												>

In [151]:

df.sample(frac=0.1) # It will retun fraction here 10% of total data as sample

Out[151]:

	total_bill	tip	sex	smoker	day	time	size	price_per_person	Payer Name	CC Number	Payment ID	last_fou
159	16.49	2.00	Male	No	Sun	Dinner	4	4.12	Christopher Soto	30501814271434	Sun1781	143
43	9.68	1.32	Male	No	Sun	Dinner	2	4.84	Christopher Spears	4387671121369212	Sun3279	921
105	15.36	1.64	Male	Yes	Sat	Dinner	2	7.68	David Price	4029957452720	Sat5106	272
237	32.83	1.17	Male	Yes	Sat	Dinner	2	16.42	Thomas Brown	4284722681265508	Sat2929	550
138	16.00	2.00	Male	Yes	Thur	Lunch	2	8.00	Jason Burgess	3561461821942363	Thur2710	236
14	14.83	3.02	Female	No	Sun	Dinner	2	7.42	Vanessa Jones	30016702287574	Sun3848	757
102	44.30	2.50	Female	Yes	Sat	Dinner	3	14.77	Heather Cohen	379771118886604	Sat6240	660
225	16.27	2.50	Female	Yes	Fri	Lunch	2	8.14	Whitney Arnold	3579111947217428	Fri6665	742
10	10.27	1.71	Male	No	Sun	Dinner	2	5.14	William Riley	566287581219	Sun2546	121
21	20.29	2.75	Female	No	Sat	Dinner	2	10.14	Natalie Gardner	5448125351489749	Sat9618	974

58	tota 1bi	1.78	Mene	smoker	dax	Di HRe	sizę	price_per_person	P ąy ęţ Gu llame	356078 262 Nunsbez	Payment Sat66	last_ggg
199	13.51	2.00	Male	Yes	Thur	Lunch	2	6.76	Joseph Murphy MD	6547218923471275	Thur2428	127
215	12.90	1.10	Female	Yes	Sat	Dinner	2	6.45	Jessica Owen	4726904879471	Sat6983	947
217	11.59	1.50	Male	Yes	Sat	Dinner	2	5.80	Gary Orr	30324521283406	Sat8489	340
205	16.47	3.23	Female	Yes	Thur	Lunch	3	5.49	Carly Reyes	4787787236486	Thur8084	648
100	11.35	2.50	Female	Yes	Fri	Dinner	2	5.68	Lori Lynch	38558279384492	Fri4106	449
74	14.73	2.20	Female	No	Sat	Dinner	2	7.36	Ashley Harris	501828723483	Sat6548	348
157	25.00	3.75	Female	No	Sun	Dinner	4	6.25	Laura Robles	213158685144262	Sun7015	426
221	13.42	3.48	Female	Yes	Fri	Lunch	2	6.71	Leslie Kaufman	379437981958785	Fri7511	878
32	15.06	3.00	Female	No	Sat	Dinner	2	7.53	Amanda Wilson	213186304291560	Sat1327	156
73	25.28	5.00	Female	Yes	Sat	Dinner	2	12.64	Julie Holmes	5418689346409571	Sat6065	957
218	7.74	1.44	Male	Yes	Sat	Dinner	2	3.87	Nicholas Archer	340517153733524	Sat4772	352
178	9.60	4.00	Female	Yes	Sun	Dinner	2	4.80	Melanie Gray	4211808859168	Sun4598	916
158	13.39	2.61	Female	No	Sun	Dinner	2	6.70	Ashley Boyd	3571088058115021	Sun982	502
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