

```
In [1]: 1 import pandas as pd
2 #step 1: create sample dataset
3 data= {
4     'Region' : ['North', 'South', 'East', 'West', 'North', 'South', 'East', 'West']
5     'Product' : ['A', 'B', 'A', 'B', 'C', 'C', 'B', 'A' ],
6     'Sales' : [150,200,300,400,250,180,220,310],
7     'Quantity' : [10,15,20,25,12,14,16,18],
8 }
9
```

```
In [2]: 1 df = pd.DataFrame(data)
2 print("Sample Dataset: \n", df)
```

Sample Dataset:

	Region	Product	Sales	Quantity
0	North	A	150	10
1	South	B	200	15
2	East	A	300	20
3	West	B	400	25
4	North	C	250	12
5	South	C	180	14
6	East	B	220	16
7	West	A	310	18

```
In [3]: 1 #step 2: grouping and aggregration
2 #aggreagrating sales by region (sum aggregation)
3 sales_by_region = df.groupby('Region')['Sales'].sum()
4 print("\n Total sales by region: \n", sales_by_region)
```

Total sales by region:

Region	Sales
East	520
North	400
South	380
West	710

Name: Sales, dtype: int64

```
In [6]: 1 #aggregating sales and quantity by product(mean aggregration)
2 mean_by_product = df.groupby('Product')[['Sales', 'Quantity']].mean()
3 print("\nMean sales by quantity by product: \n ", mean_by_product)
```

Mean sales by quantity by product:

Product	Sales	Quantity
A	253.333333	16.000000
B	273.333333	18.666667
C	215.000000	13.000000

```
In [8]: 1 #aggregating cunt of sales by region(cuint agggreagrations)
2 count_by_region = df.groupby('Region')['Sales'].count()
3 print("\n Count of sales records by region:\n ",sales_by_region)
```

Count of sales records by region:

Region	Sales
East	520
North	400
South	380
West	710

Name: Sales, dtype: int64

```
In [10]: 1 #custom aggregation: calculate min and max: sales by region
2 custom_aggregation = df.groupby('Region')['Sales'].agg(['min', 'max'])
3 print("\n Custom aggregation (min and max sales by region): \n ", custom_aggregation)
```

Custom aggregation (min and max sales by region):

	min	max
Region		
East	220	300
North	150	250
South	180	200
West	310	400

```
In [11]: 1 #step 3: multilevel aggregation
2 #aggregating sales by region and product
3 multi_level_agg = df.groupby(['Region', 'Product'])['Sales'].sum()
4 print("\n sales by region and product:\n" , multi_level_agg)
```

sales by region and product:

Region	Product	
East	A	300
	B	220
North	A	150
	C	250
South	B	200
	C	180
West	A	310
	B	400

Name: Sales, dtype: int64

```
In [12]: 1 #step 4: reset index for multilevel aggregation
2 multi_level_agg_reset = multi_level_agg.reset_index()
3 print("\n Sales by region and product (reset index):\n" , multi_level_agg_reset)
```

Sales by region and product (reset index):

	Region	Product	Sales
0	East	A	300
1	East	B	220
2	North	A	150
3	North	C	250
4	South	B	200
5	South	C	180
6	West	A	310
7	West	B	400

```
In [ ]: 1 Objective:
2
3 To understand and implement:
4
5 Time Aggregation: Aggregating data over different time periods (e.g., monthly, year
6
7 Spatial Aggregation: Aggregating data by spatial attributes (e.g., by region, city)
```

```
In [15]: 1 import pandas as pd
2 #step 1: extend dataset with time and spatial data
3 data= {
4     'Region' : ['North', 'South', 'East', 'West', 'North', 'South', 'East', 'West']
5     'City' : ['City1', 'City2', 'City3', 'City4', 'City1', 'City2', 'City3', 'City4'],
6     'Product' : ['A', 'B', 'A', 'B', 'C', 'C', 'B', 'A' ],
7     'Sales' : [150,200,300,400,250,180,220,310],
8     'Quantity' : [10,15,20,25,12,14,16,18],
9     'Date': pd.to_datetime(['2024-01-01', '2024-01-02', '2024-02-01', '2024-02-03', '20
10 }
11
```

```
In [16]: 1 df=pd.DataFrame(data)
2 print("Extended Dataset:\n" , df)
```

Extended Dataset:

	Region	City	Product	Sales	Quantity	Date
0	North	City1	A	150	10	2024-01-01
1	South	City2	B	200	15	2024-01-02
2	East	City3	A	300	20	2024-02-01
3	West	City4	B	400	25	2024-02-03
4	North	City1	C	250	12	2024-03-01
5	South	City2	C	180	14	2024-03-02
6	East	City3	B	220	16	2024-04-01
7	West	City4	A	310	18	2024-04-03

```
In [18]: 1 #time aggregraion
2 #step 2 :set date column as index
3 df.set_index('Date', inplace=True)
```

```
In [20]: 1 #aggregrating sales by month
2 monthly_sales = df.resample('M')['Sales'].sum()
3 print("\n Total sales by month: \n" , monthly_sales)
```

Total sales by month:

Date	Sales
2024-01-31	350
2024-02-29	700
2024-03-31	430
2024-04-30	530

Freq: M, Name: Sales, dtype: int64

```
In [21]: 1 #aggreagraing sales by quarter
2 quarterly_sales=df.resample('Q')['Sales'].sum()
3 print("\n Total sales by quarter:\n ",quarterly_sales)
```

Total sales by quarter:

Date	Sales
2024-03-31	1480
2024-06-30	530

Freq: Q-DEC, Name: Sales, dtype: int64

```
In [22]: 1 #aggregrating sales by year
2 yearly_sales = df.resample('Y')['Sales'].sum()
3 print("\n Total sales by Year" , yearly_sales)
```

Total sales by Year Date

Date	Sales
2024-12-31	2010

Freq: A-DEC, Name: Sales, dtype: int64

```
In [23]: 1 #reset index to store original structure
        2 df.reset_index(inplace=True)
```

```
In [24]: 1 #spatial aggregation
```

```
In [26]: 1 #step 3: aggragrating sales by region
        2 sales_by_region = df.groupby('Region')['Sales'].sum()
        3 print("\n total sales by region: \n" , sales_by_region)
```

```
total sales by region:
Region
East      520
North     400
South     380
West      710
Name: Sales, dtype: int64
```

```
In [28]: 1 #aggreating sales by city
        2 sales_by_city= df.groupby('City')['Sales'].sum()
        3 print("\n Total sales by city: \n",sales_by_city)
```

```
Total sales by city:
City
City1     400
City2     380
City3     520
City4     710
Name: Sales, dtype: int64
```

```
In [31]: 1 #aggregrating sales by city aND REGION
        2 sales_by_city_and_region = df.groupby(['Region', 'City'])['Sales'].sum()
        3 print("\n sales by city and region: \n", sales_by_city_and_region)
```

```
sales by city and region:
Region City
East    City3     520
North   City1     400
South   City2     380
West    City4     710
Name: Sales, dtype: int64
```

```
In [32]: 1 #step 4 export spatial aggregation resul;ts
        2 sales_by_city_and_region_reset = sales_by_city_and_region.reset_index()
        3
        4 sales_by_city_and_region_reset.to_csv("Spatial_aggreagraion.csv" , index=False)
        5 print("data saved")0
        6
```

data saved

```
In [ ]: 1
```