

► Online Retail - RFM & KMeans Clustering

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The online retail

RFM analysis

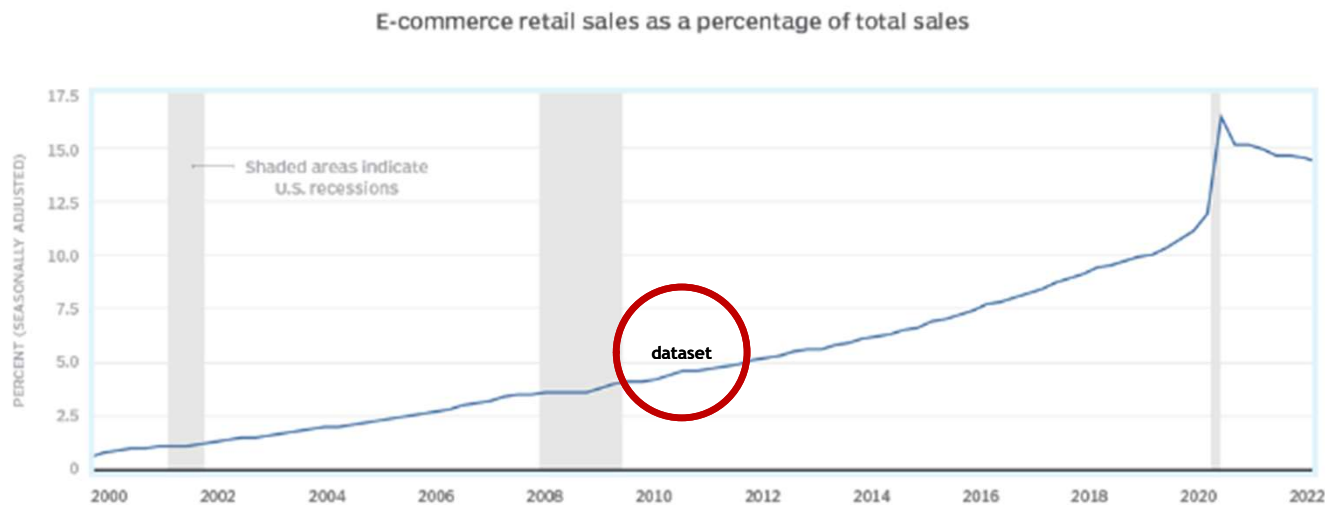
Further takes



Content

1 The online retail (E-Commerce)

- ▶ E-commerce retail sales on the rise
- ▶ Online shopping can track process, activities, essential information, etc.
→ Customer-centric business intelligence



1 The online retail (E-Commerce)

Online retailers have the following common business **concerns**:

- ▶ Who are the most/least **valuable** or loyal customers? What are the distinct **characteristics** of them?
- ▶ What are customers' purchase **behavior** patterns?
- ▶ What are the sales **patterns** in terms of various perspectives such as products, regions, and time?
- ▶ Which types of customers are more likely to respond to a certain **promotion** mailing and so on?

1 The online retail (E-Commerce)



2 Dataset

- ▶ Dataset has the transactions occurring from Dec 2010 to Dec 2011 for a **non-store** online retail based in UK.
- ▶ Items are unique all-occasion **gifts**.
- ▶ Many customers of the company are wholesalers in **37** countries.

	InvoiceNo	StockCode	Description	Quantity	InvoiceDate	UnitPrice	CustomerID	Country
0	536365	85123A	WHITE HANGING HEART T-LIGHT HOLDER	6	12/1/2010 8:26	2.55	17850.0	United Kingdom
1	536365	71053	WHITE METAL LANTERN	6	12/1/2010 8:26	3.39	17850.0	United Kingdom
2	536365	84406B	CREAM CUPID HEARTS COAT HANGER	8	12/1/2010 8:26	2.75	17850.0	United Kingdom
3	536365	84029G	KNITTED UNION FLAG HOT WATER BOTTLE	6	12/1/2010 8:26	3.39	17850.0	United Kingdom
4	536365	84029E	RED WOOLLY HOTTIE WHITE HEART.	6	12/1/2010 8:26	3.39	17850.0	United Kingdom


```
df.shape
```

```
(541909, 8)
```

2 Dataset

	InvoiceNo	StockCode	Description	Quantity	InvoiceDate	UnitPrice	CustomerID	Country
0	536365	85123A	WHITE HANGING HEART T-LIGHT HOLDER	6	12/1/2010 8:26	2.55	17850.0	United Kingdom
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For applying RFM method



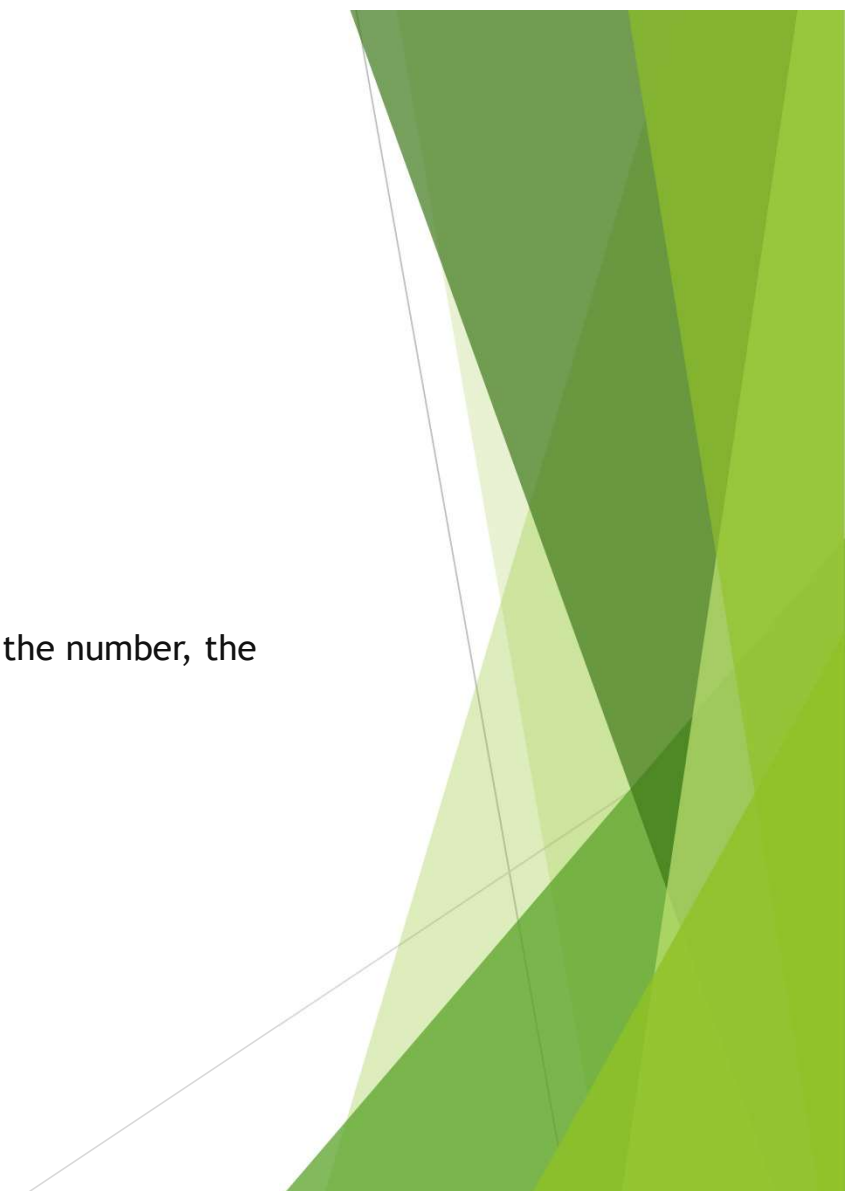
	CustomerID	Recency	Frequency	Monetary
0	12346	326	1	77183.60
1	12347	3	7	4310.00
2	12348	76	4	1437.24
3	12349	19	1	1457.55
4	12350	311	1	294.40

3 RFM analysis

The RFM model is based on three quantitative factors:

- ▶ **Recency:** How recently a customer has made a purchase
- ▶ **Frequency:** How often a customer makes a purchase
- ▶ **Monetary:** How much money a customer spends on purchases

Then ranking a customer in each factor on a scale of 1 to 5 (the higher the number, the better the result)



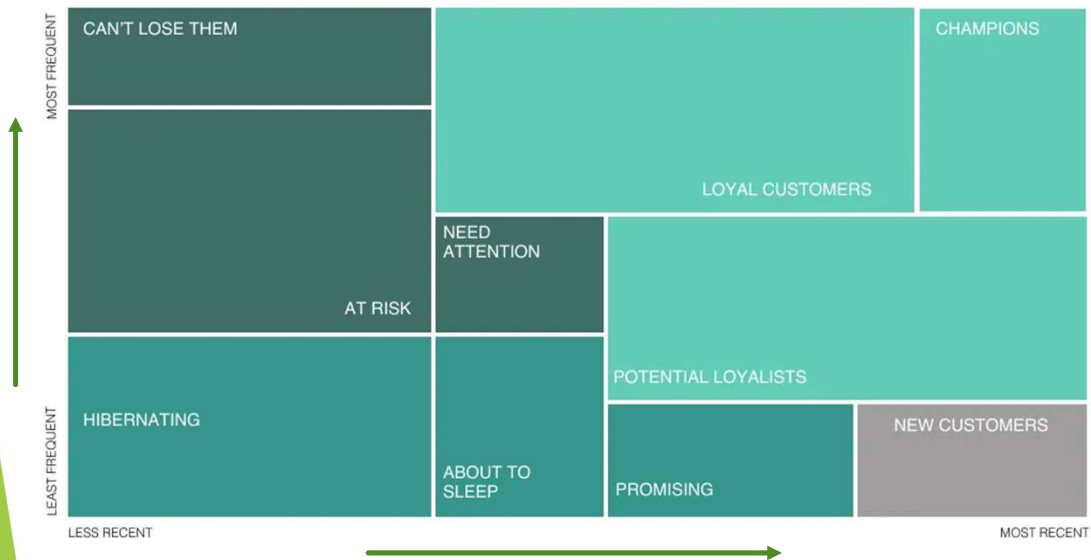
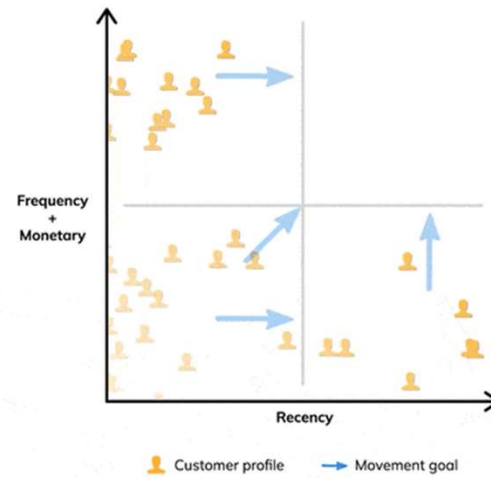
3 RFM analysis

	CustomerID	Recency	Frequency	Monetary
0	12346	326	1	77183.60
1	12347	3	7	4310.00
2	12348	76	4	1437.24
3	12349	19	1	1457.55
4	12350	311	1	294.40

create 3 new columns
of scores by 'qcut'

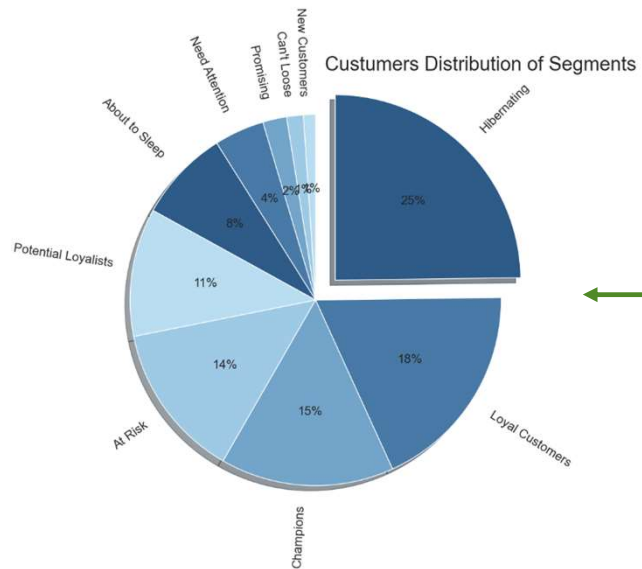
	CustomerID	Recency	Frequency	Monetary	Recency_score	Frequency_score	Monetary_score	RFM_score
0	12346	326	1	77183.60	1	1	5	115
1	12347	3	7	4310.00	5	5	5	555
2	12348	76	4	1437.24	2	4	4	244
3	12349	19	1	1457.55	4	1	4	414
4	12350	311	1	294.40	1	1	2	112

3 RFM analysis



3 RFM analysis

	CustomerID	Recency	Frequency	Monetary	Recency_score	Frequency_score	Monetary_score	RFM_score	Segment
0	12346	326	1	77183.60	1	1	5	115	Hibernating
1	12347	3	7	4310.00	5	5	5	555	Champions
2	12348	76	4	1437.24	2	4	4	244	At Risk
3	12349	19	1	1457.55	4	1	4	414	Promising
4	12350	311	1	294.40	1	1	2	112	Hibernating

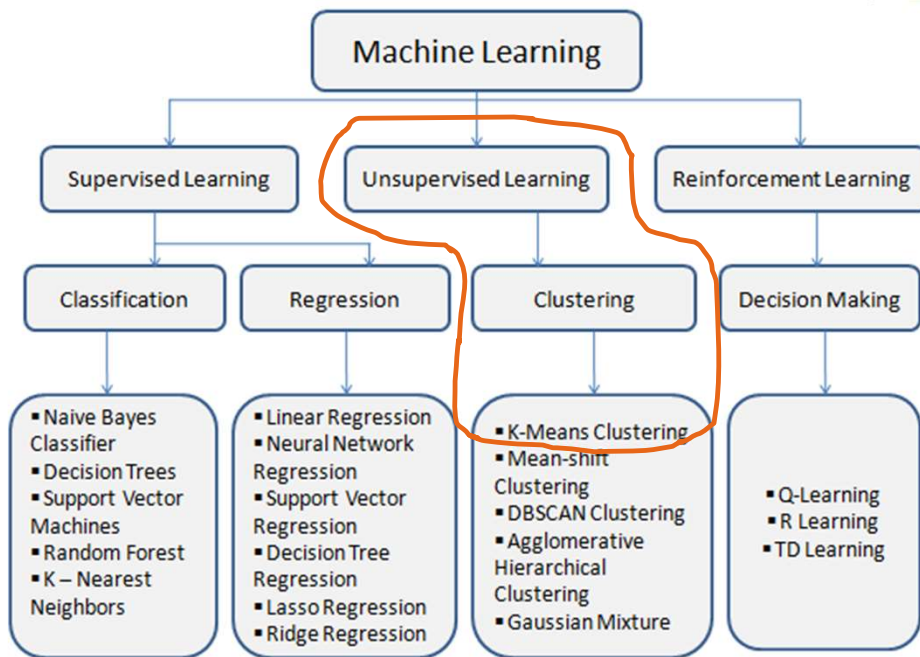
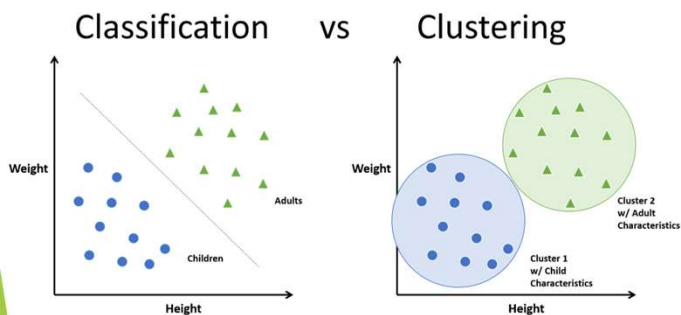


Segment	Count
7 New Customers	46
2 Can't Loose	63
9 Promising	90
6 Need Attention	189
0 About to Sleep	348
8 Potential Loyalists	484
1 At Risk	587
3 Champions	655
5 Loyal Customers	798
4 Hibernating	1074

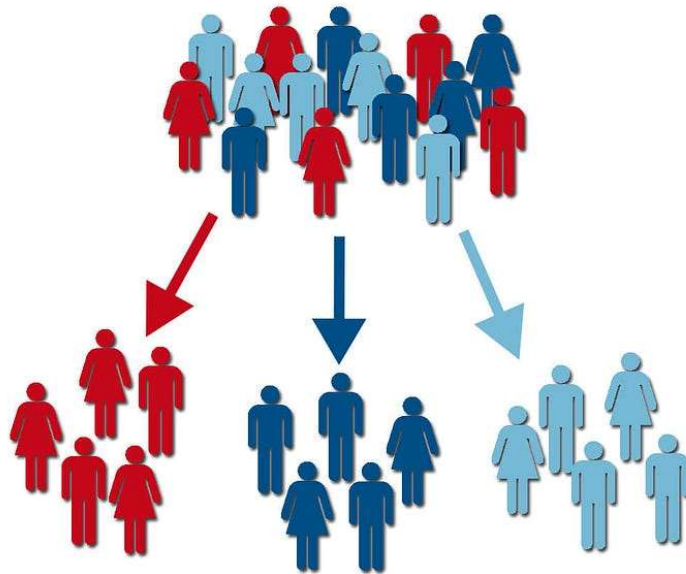
4 KMeans Clustering

Three popular types of **clustering** algorithms:

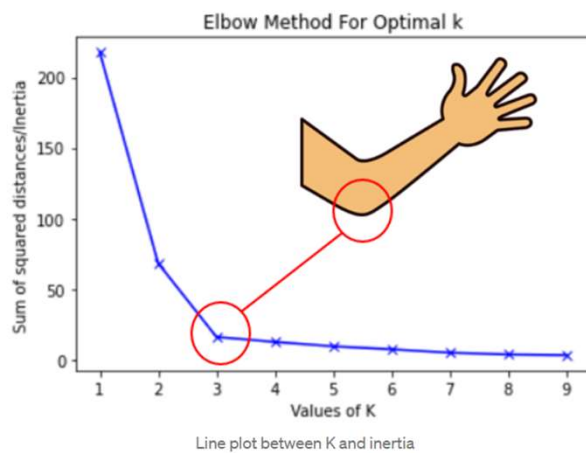
1. Partitional clustering -> **KMeans**
2. Hierarchical clustering
3. Density-based clustering



4 KMeans Clustering



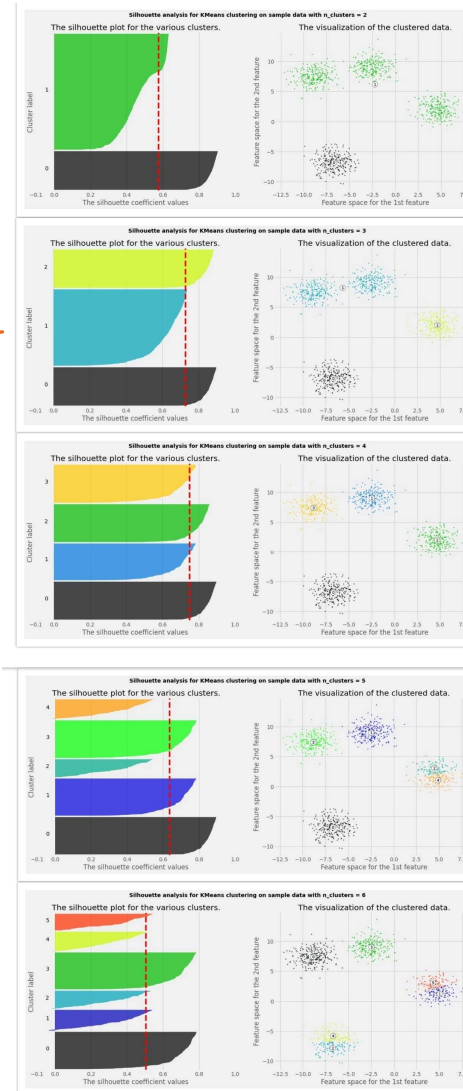
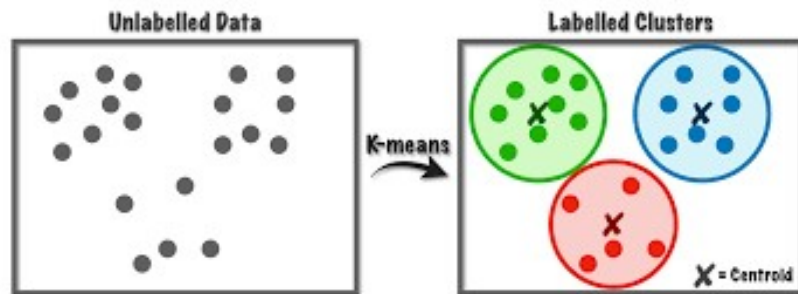
4 KMeans Clustering



Elbow method or /and
Silhouette score

to get **k**

model = KMeans(n_clusters = 3)

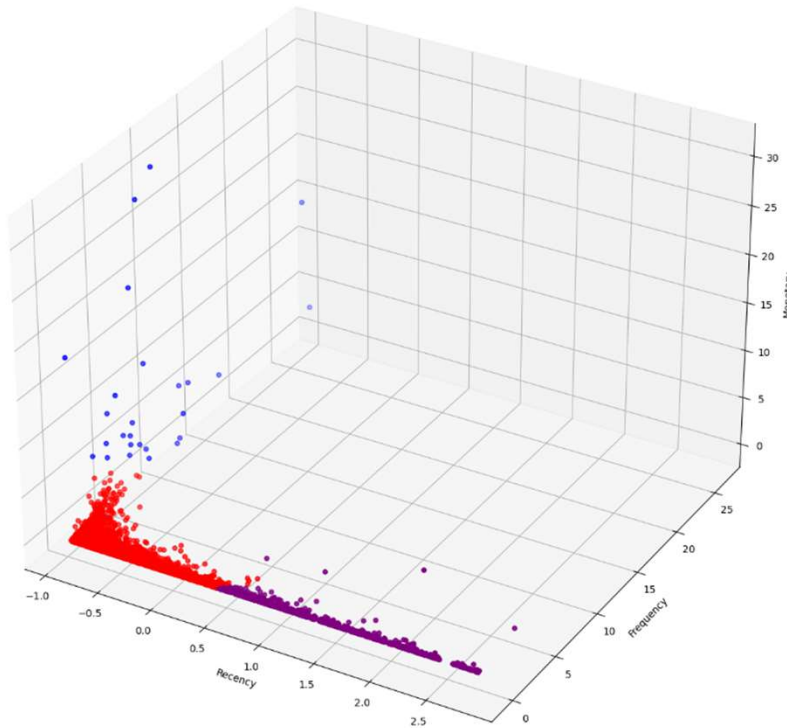


4 KMeans Clustering

RFM & KMeans

Apply 2 model
layers

Deep Learning



5 Further takes

- ▶ Answer more questions in Exploratory Data Analysis (EDA) such as sales trend, new customers, & transactions by time
- ▶ Apply Time Series models for forecasting the trend of purchases
- ▶ Study more 3D visualizations for Clustering models

Thank you!