

HW2: Predicting 2022 citation numbers using the university rank and 2017-2021 citation numbers.

Dataset used: 41-50.csv

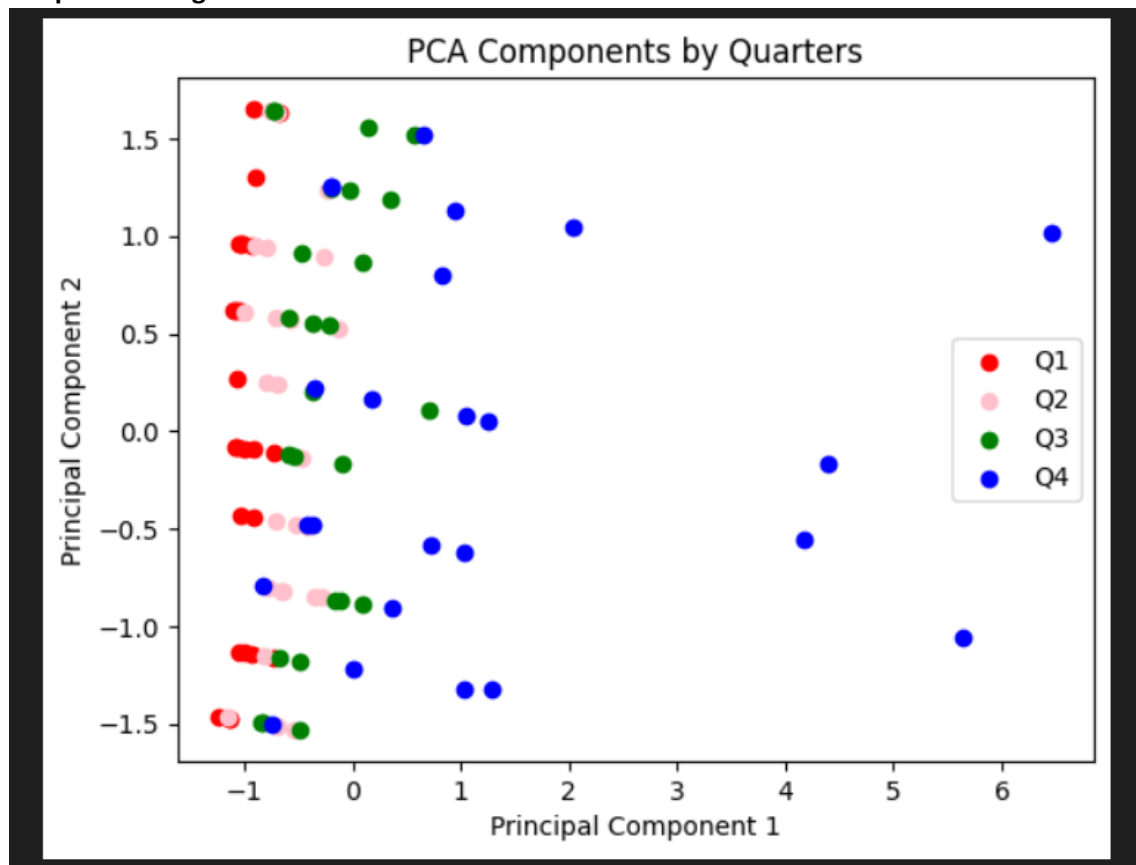
PCA for Dimension Reduction: PCA is a dimensionality reduction technique that helps simplify the dataset by transforming the original features into a new set of uncorrelated variables called principal components.

In the provided code, we used PCA to reduce the dimensionality of the dataset from six features (cit_2017, cit_2018, cit_2019, cit_2020, cit_2021) to two principal components (PC1 and PC2). This dimension reduction is valuable for data visualization and simplifying modeling, as it reduces the number of features and allows to work with a lower-dimensional dataset.

Scatter Plot Analysis: The scatter plot is a visual representation of data points in a two-dimensional space, with colors indicating the quarters (Q1, Q2, Q3, Q4) of 2022 citation numbers.

Observing the scatter plot, we can see that there is no clear separation or clustering of data points based on the quarters. Data points from all quarters appear overlapped and scattered throughout the plot. This suggests that the two principal components (PC1 and PC2) do not have a strong ability to discriminate or separate the quarters based on the 2022 citation numbers.

Output for the given data:



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Prediction of values using linear regression model:

Linear regression assumes a linear relationship between the independent variables (features) and the dependent variable (target). In this case, a more complex or non-linear model might be more appropriate for predicting 2022 citation numbers accurately.

Mean Squared Error: 65226.5350506074		
R-squared: -0.2860114291264413		
	Test	Predicted
83	406	770.708908
53	679	703.266161
70	406	636.751567
45	399	306.737443
44	488	560.205705
39	233	225.419239
22	737	165.254612
80	424	461.049604
10	310	267.081233
0	473	172.064215
18	61	47.242297
30	102	38.800627
73	237	427.705152
33	232	325.554866
90	605	883.448644
4	50	-42.992364
76	58	55.333047
77	184	67.006735
12	663	1237.623659
31	760	1211.505397

Mean Squared Error (MSE): The calculated MSE for the linear regression model is quite high (approximately 65,226.54), indicating a significant difference between the predicted and actual values.

R-squared (R²) Score: The R-squared score is negative (-0.286), which indicates that the model does not fit the data well and may perform worse than a horizontal line.

In summary, while PCA is a valuable technique for dimensionality reduction and data visualization, its application to this specific prediction task did not lead to favorable results. The scatter plot confirmed that data points from different quarters were not clearly separable in the two-dimensional PCA space. To improve prediction accuracy, we should consider more advanced modeling techniques or feature engineering, as the relationship between features and the target variable seems to be non-linear and complex.

References: <https://scikit-learn.org/stable/modules/generated/sklearn.decomposition.PCA.html>

<https://www.youtube.com/watch?v=fkf4IBRSeEc>