

To gain further insights into the significant associations revealed by the Chi-squared tests, here are some practical steps to investigate the positive results more deeply:

1. Explore Key Variable Combinations with Higher Expected Frequencies:

- Many tests showed a warning about low expected frequencies, which can affect the reliability of the Chi-squared test results. To handle this, we can group certain levels of the variables (e.g., aggregating certain cities or segments) to increase the expected frequencies.
- After grouping, re-run the Chi-squared tests on these newly categorized data to ensure more reliable results and refine our understanding of the associations.

2. Perform Post-hoc Analyses for Segment Associations:

- Since associations between **Segment** and variables like **State**, **City**, **Ship Mode**, and **Order Month** showed significant results, post-hoc tests (such as pairwise comparisons) could clarify which levels within the Segment variable are driving the associations.
- These insights could be vital for marketing strategies, as we could determine the specific segments that engage more with particular states or cities.

3. Use Visualization to Deepen Insights:

- Creating heatmaps or clustered bar charts can help visualize the association strength between categories. For instance, heatmaps comparing **City** and **Segment** or **State** and **Ship Mode** could help identify distinct patterns in the relationships.
- Visualizations may reveal specific trends or hotspots in customer segments and sales behaviors that the statistical tests alone don't convey.

4. Investigate Seasonal and Regional Patterns:

- The associations of **Order Month** with variables like **Segment** and **Ship Mode** suggest seasonal or monthly influences on customer behavior. Further analysis could involve creating time series visualizations for each segment or ship mode to capture any seasonal trends or patterns.
- For regional insights, a follow-up on **State** and **Region** interactions may reveal whether specific product categories or segments show regional

preferences, which could inform region-targeted marketing or inventory adjustments.

5. Consider Logistic Regression or Cluster Analysis for Deeper Relationship Analysis:

- Given the multiple associations between variables (e.g., **Segment, State, Region, and Ship Mode**), using **logistic regression** could allow us to model the probability of a particular segment or ship mode being associated with specific states, cities, or time periods. This could provide a predictive view on how these factors interact.
- **Cluster analysis** could also be applied here to group similar cities or states based on customer segments, order month, or ship mode preferences. K-means clustering or hierarchical clustering could be particularly effective, potentially uncovering naturally occurring groups in the data.

6. Further Analysis on Large Variable Pairings:

- For pairs with larger degrees of freedom and high Chi-squared statistics (like **City vs. State** or **City vs. Region**), breaking down the analysis to focus on high-performing cities or regions could provide actionable insights without the reliability issues seen in the full dataset.
- For instance, focusing on the top sales regions or cities to analyze their specific associations could yield more practical insights, especially since these are likely to drive the larger trends and impact.

Each of these approaches will help us go beyond the initial Chi-squared results, allowing us to understand not only the significance but also the practical applications of the associations revealed in our data.