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    "Are they also profitable - what is the profit margin across the buckets\n",
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    "Which customer segment is most profitable in each year ( there is a column called customer segment)\n",
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    "How the customers are distributed across the countries - pie chart\n",
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    "   # d.append(x['Shipping Cost'].sum())\n",
    "    #d.append(pd.to_datetime(x['Order Date']).min())\n",
    "   ##d.append(x['City'].nunique())\n",
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['Purchases','Total_Sales','Total_Cost','First_Purchase_Date','Latest_Purchase_Date','Locati
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