

In [52]:

```
import pandas as pd
import numpy as np
```

In [53]:

```
#name of csv file
file_to_load = 'purchase_data.csv'
```

In [54]:

```
#read csv file
purchase_data_df = pd.read_csv(file_to_load)
purchase_data_df.head()
```

Out[54]:

	Purchase ID	SN	Age	Gender	Item ID	Item Name	Price
0	0	Lisim78	20	Male	108	Extraction, Quickblade Of Trembling Hands	3.53
1	1	Lisovynya38	40	Male	143	Frenzied Scimitar	1.56
2	2	Ithergue48	24	Male	92	Final Critic	4.88
3	3	Chamassasya86	24	Male	100	Blindscythe	3.27
4	4	Iskosia90	23	Male	131	Fury	1.44

In [55]:

Out[55]:

```
Purchase ID    780
SN             780
Age            780
Gender         780
Item ID        780
Item Name      780
Price          780
dtype: int64
```

```
#remove rows with missing data
clean_purchase_data_df = purchase_data_df.dropna(how="any")
clean_purchase_data_df.count()
```

In [49]:

```
#display the total number of players
players_count = pd.DataFrame.count('SN')
```

```
-----
-----
AttributeError                                Traceback (most recent call
last)
<ipython-input-49-830e612c58e8> in <module>()
      1 #display the total number of players
----> 2 players_count = pd.DataFrame.count('SN')

/anaconda3/lib/python3.7/site-packages/pandas/core/frame.py in count(s
elf, axis, level, numeric_only)
    6776         Myla          1
    6777         """
-> 6778         axis = self._get_axis_number(axis)
    6779         if level is not None:
    6780             return self._count_level(level, axis=axis,
```

AttributeError: 'str' object has no attribute '_get_axis_number'

In [206]:

```
#clean the data
player_info = purchase_data_df.loc[:,["Gender","SN"]]
player_info = player_info.drop_duplicates()
number_of_players = player_info.count()
```

In [207]:

```
#total player count
pd.DataFrame({"Total Players": [number_of_players]})
```

Out[207]:

Total Players

0 Gender 576 SN 576 dtype: int64

In [208]:

```
print("The total number of players is: 576")
```

The total number of players is: 576

In [209]:

```
#Purchasing Analysis
average_item_price = purchase_data["Price"].mean()
total_purchase_value = purchase_data["Price"].sum()
purchase_count = purchase_data["Price"].count()
item_count = len(purchase_data["Item ID"].unique())

# Create a DataFrame to hold results
summary_table = pd.DataFrame({"Number of Unique Items": item_count,
                              "Total Revenue": [total_purchase_value],
                              "Number of Purchases": [purchase_count],
                              "Average Price": [average_item_price]})

# Minor Data Munging
summary_table = summary_table.round(2)
summary_table["Average Price"] = summary_table["Average Price"].map("${:,.2f}".format)
summary_table["Number of Purchases"] = summary_table["Number of Purchases"].map("{}")
summary_table["Total Revenue"] = summary_table["Total Revenue"].map("${:,.2f}".format)
summary_table = summary_table.loc[:,["Number of Unique Items", "Average Price", "Number of Purchases", "Total Revenue"]]

# Display the summary_table
summary_table
```

Out[209]:

	Number of Unique Items	Average Price	Number of Purchases	Total Revenue
0	183	\$3.05	780	\$2,379.77

In [223]:

```
#Gender Demographics
# Calculate the Number and Percentage by Gender
gender_demographics_totals_df = player_info["Gender"].value_counts()
gender_demographics_percents_df = gender_demographics_totals_df / number_of_players
gender_demographics_df = pd.DataFrame({"Total Count": gender_demographics_totals_df,
gender_demographics_df
```

Out[223]:

	Total Count	Percentage of Players
Female	81.0	NaN
Gender	NaN	NaN
Male	484.0	NaN
Other / Non-Disclosed	11.0	NaN
SN	NaN	NaN

In [212]:

```
#Purchasing Analysis - total purchase value

purchase_total_by_gender = pd.DataFrame(purchase_data_df.groupby(["Gender"]).sum()["Total Purchase Value"])
purchase_total_by_gender
```

Out[212]:

	Total Purchase Value
Gender	
Female	361.94
Male	1967.64
Other / Non-Disclosed	50.19

In [174]:

```
#Average Purchase Price by Gender
avg_purchase_gender = pd.DataFrame(purchase_data_df.groupby([ "Gender" ]).mean()[ "Price" ])
avg_purchase_gender.round(2)
```

Out[174]:

Average Purchase Price	
Gender	
Female	3.20
Male	3.02
Other / Non-Disclosed	3.35

In [173]:

```
#Purchase Count by Gender
gender_count= pd.DataFrame(purchase_data_df.groupby([ "Gender" ]).count()[ "Price" ].reset_index())
gender_count
```

Out[173]:

Purchase Count	
Gender	
Female	113
Male	652
Other / Non-Disclosed	15

In [227]:

```
gender_demographics_totals_df = player_info[ "Gender" ].value_counts()
gender_demographics_percents_df = gender_demographics_totals_df / number_of_players
gender_demographics_df = pd.DataFrame({ "Total Count": gender_demographics_totals_df,
                                         "Percentage": gender_demographics_percents_df })

purchase_total_by_gender = pd.DataFrame(purchase_data_df.groupby([ "Gender" ]).sum()[ "Price" ])

avg_purchase_gender = pd.DataFrame(purchase_data_df.groupby([ "Gender" ]).mean()[ "Price" ])
avg_purchase_gender.round(2)

gender_count= pd.DataFrame(purchase_data_df.groupby([ "Gender" ]).count()[ "Price" ].reset_index())
```

```

avg_total_purchase_person = purchase_total_by_gender / gender_demographics_df["Total
gender_data = pd.DataFrame({"Purchase Count": gender_count, "Average Purchase Price"

```

```

-----
-----
ValueError                                Traceback (most recent call
last)
<ipython-input-227-23d9fc1dffff> in <module>()
      12 avg_total_purchase_person = purchase_total_by_gender /
gender_demographics_df["Total Count"]
      13
--> 14 gender_data = pd.DataFrame({"Purchase Count": gender_count, "A
verage Purchase Price": avg_purchase_gender, "Total Purchase Value":
purchase_total_by_gender, "Average Total Purchase per Person":avg_tota
l_purchase_person})

/anaconda3/lib/python3.7/site-packages/pandas/core/frame.py in __init_
__(self, data, index, columns, dtype, copy)
      346                                     dtype=dtype, copy=copy)
      347         elif isinstance(data, dict):
--> 348             mgr = self._init_dict(data, index, columns, dtype=
dtype)
      349         elif isinstance(data, ma.MaskedArray):
      350             import numpy.ma.mrecords as mrecords

/anaconda3/lib/python3.7/site-packages/pandas/core/frame.py in _init_d
ict(self, data, index, columns, dtype)
      457             arrays = [data[k] for k in keys]
      458
--> 459         return _arrays_to_mgr(arrays, data_names, index,
columns, dtype=dtype)
      460
      461     def _init_ndarray(self, values, index, columns, dtype=None
, copy=False):

/anaconda3/lib/python3.7/site-packages/pandas/core/frame.py in _arrays
_to_mgr(arrays, arr_names, index, columns, dtype)
      7354         # figure out the index, if necessary
      7355         if index is None:
-> 7356             index = extract_index(arrays)
      7357
      7358         # don't force copy because getting jammed in an ndarray an
yway

/anaconda3/lib/python3.7/site-packages/pandas/core/frame.py in extract
_index(data)
      7391
      7392         if not indexes and not raw_lengths:
-> 7393             raise ValueError('If using all scalar values, you
must pass'
      7394                                     ' an index')

```

ValueError: If using all scalar values, you must pass an index

In [228]:

```
#average total purchase per person
avg_purchase_total= purchase_total_by_gender / gender_demographics_totals["Total Count"]
avg_purchase_total
```

TypeError Traceback (most recent call last)

/anaconda3/lib/python3.7/site-packages/pandas/core/indexes/base.py in get_value(self, series, key)

```
3123         try:
-> 3124             return libindex.get_value_box(s, key)
3125         except IndexError:
```

pandas/_libs/index.pyx in pandas._libs.index.get_value_box()

pandas/_libs/index.pyx in pandas._libs.index.get_value_box()

TypeError: 'str' object cannot be interpreted as an integer

During handling of the above exception, another exception occurred:

KeyError Traceback (most recent call last)

<ipython-input-228-4dd28951f59c> in <module>()

```
1 #average total purchase per person
----> 2 avg_purchase_total= purchase_total_by_gender /
gender_demographics_totals["Total Count"] * 100
3 avg_purchase_total
```

/anaconda3/lib/python3.7/site-packages/pandas/core/series.py in __getitem__(self, key)

```
765         key = com._apply_if_callable(key, self)
766         try:
--> 767             result = self.index.get_value(self, key)
768
769             if not is_scalar(result):
```

/anaconda3/lib/python3.7/site-packages/pandas/core/indexes/base.py in get_value(self, series, key)

```
3130             raise InvalidIndexError(key)
3131         else:
-> 3132             raise e1
3133     except Exception: # pragma: no cover
```



```
3134         raise e1
/anaconda3/lib/python3.7/site-packages/pandas/core/indexes/base.py in
get_value(self, series, key)
3116         try:
3117             return self._engine.get_value(s, k,
-> 3118
tz=getattr(series.dtype, 'tz', None))
3119         except KeyError as e1:
3120             if len(self) > 0 and self.inferred_type in ['integ
er', 'boolean']:
```

```
pandas/_libs/index.pyx in pandas._libs.index.IndexEngine.get_value()
pandas/_libs/index.pyx in pandas._libs.index.IndexEngine.get_value()
pandas/_libs/index.pyx in pandas._libs.index.IndexEngine.get_loc()
pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyOb
jectHashTable.get_item()
pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyOb
jectHashTable.get_item()
```

KeyError: 'Total Count'

In [172]:

Out[172]:

	Purchase Count	Average Purchase Price	Purchase Total
0	Purchase Count Gender ...	Average Purchase Price ...	Total Purchase Value Ge...

In [186]:

```
gender_percentage = gender_count/576
gender_percentage.round(2)
```

Out[186]:

Purchase Count	
Gender	
Female	0.20
Male	1.13
Other / Non-Disclosed	0.03

In [182]:

```
# Establish the bins
age_bins = [0, 9.90, 14.90, 19.90, 24.90, 29.90, 34.90, 39.90, 99999]
group_names = ["<10", "10-14", "15-19", "20-24", "25-29", "30-34", "35-39", "40+"]

# Categorize players using age range
player_info["Age Range"] = pd.cut(player_info["Age"], age_bins, labels=group_names)

age_demographics_totals = player_info["Age Ranges"].value_counts()
age_demographics_percents = age_demographics_totals / number_of_players * 100
age_demographics = pd.DataFrame({"Total Count": age_demographics_totals, "Percentage": age_demographics_percents})
age_demographics.sort_index()
```

Out[182]:

	Total Count	Percentage of Players
10-14	22.0	NaN
15-19	107.0	NaN
20-24	258.0	NaN
25-29	77.0	NaN
30-34	52.0	NaN
35-39	31.0	NaN
40+	12.0	NaN
<10	17.0	NaN
Age	NaN	NaN
Gender	NaN	NaN
SN	NaN	NaN

In [230]:

```
#Age Demographics

#Bin the purchasing data
purchase_data_df["Age Ranges"] = pd.cut(purchase_data_df["Age"], age_bins, labels=group_names)
age_purchase_total_df = purchase_data_df.groupby(["Age Ranges"]).sum()["Price"].rename("Age Purchase Total")
purchase_data_df["Age Range"] = pd.cut(purchase_data_df["Age"], age_bins, labels=group_names)

# Run basic calculations
age_purchase_total = purchase_data_df.groupby(["Age Ranges"]).sum()["Price"].rename("Age Purchase Total")
age_average = purchase_data_df.groupby(["Age Ranges"]).mean()["Price"].rename("Age Average")
age_counts = purchase_data_df.groupby(["Age Ranges"]).count()["Price"].rename("Age Counts")
```

```
# Calculate Normalized Purchasing
normalized_total = age_purchase_total / age_demographics["Total Count"]

# Convert to DataFrame
age_data = pd.DataFrame({"Purchase Count": age_counts, "Average Purchase Price": age

# Minor Data Munging
age_data["Average Purchase Price"] = age_data["Average Purchase Price"].map("${:,.2f}")
age_data["Total Purchase Value"] = age_data["Total Purchase Value"].map("${:,.2f}")
age_data["Purchase Count"] = age_data["Purchase Count"].map("{:,}".format)
age_data["Normalized Totals"] = age_data["Normalized Totals"].map("${:,.2f}".format)
age_data = age_data.loc[:, ["Purchase Count", "Average Purchase Price", "Total Purchase Value", "Normalized Totals"]]

# Display the Age Table
age_data.sort_index()
```

Out[230]:

	Purchase Count	Average Purchase Price	Total Purchase Value	Normalized Totals
10-14	28.0	\$2.96	\$82.78	\$3.76
15-19	136.0	\$3.04	\$412.89	\$3.86
20-24	365.0	\$3.05	\$1,114.06	\$4.32
25-29	101.0	\$2.90	\$293.00	\$3.81
30-34	73.0	\$2.93	\$214.00	\$4.12
35-39	41.0	\$3.60	\$147.67	\$4.76
40+	13.0	\$2.94	\$38.24	\$3.19
<10	23.0	\$3.35	\$77.13	\$4.54
Age	nan	\$nan	\$nan	\$nan
Gender	nan	\$nan	\$nan	\$nan
SN	nan	\$nan	\$nan	\$nan

In [241]:

```
#Top Spenders
user_total = purchase_data_df.groupby(["SN"]).sum()["Price"].rename("Total Purchase Value")
user_average = purchase_data_df.groupby(["SN"]).mean()["Price"].rename("Average Purchase Price")
user_count = purchase_data_df.groupby(["SN"]).count()["Price"].rename("Purchase Count")
```

In [250]:

```
user_total = pd.DataFrame(purchase_data_df.groupby([ "SN" ]).sum()[ "Price" ].rename( "Total Purchase Value" ))
user_total.head(5)
```

Out[250]:

Total Purchase Value	
SN	
Adairialis76	2.28
Adastirin33	4.48
Aeda94	4.91
Aela59	4.32
Aelaria33	1.79

In [252]:

```
user_average = pd.DataFrame(purchase_data_df.groupby([ "SN" ]).mean()[ "Price" ].rename( "Average Purchase Price" ))
user_average.head(5)
```

Out[252]:

Average Purchase Price	
SN	
Adairialis76	2.28
Adastirin33	4.48
Aeda94	4.91
Aela59	4.32
Aelaria33	1.79

In [251]:

```
user_count = pd.DataFrame(purchase_data_df.groupby([ "SN" ]).count()[ "Price" ].rename('user_count').head(5))
```

Out[251]:

Purchase Count	
SN	
Adairialis76	1
Adastirin33	1
Aeda94	1
Aela59	1
Aelaria33	1

In [254]:

```
#most popular items
item_data = purchase_data_df.loc[:,["Item ID", "Item Name", "Price"]]

total_item_purchase = item_data.groupby(["Item ID", "Item Name"]).sum()["Price"].rename("Total Purchase Value")
average_item_purchase = item_data.groupby(["Item ID", "Item Name"]).mean()["Price"].rename("Average Item Price")
item_count = item_data.groupby(["Item ID", "Item Name"]).count()["Price"].rename("Purchase Count")

item_data_pd = pd.DataFrame({"Total Purchase Value": total_item_purchase, "Item Price": average_item_purchase, "Purchase Count": item_count})

item_data_pd["Item Price"] = item_data_pd["Item Price"].map("${:,.2f}".format)
item_data_pd["Purchase Count"] = item_data_pd["Purchase Count"].map("{:,}".format)
item_data_pd["Total Purchase Value"] = item_data_pd["Total Purchase Value"].map("${:,.2f}".format)
item_data_pd = item_data_pd.loc[:,["Purchase Count", "Item Price", "Total Purchase Value"]]

# Display the Item Table
item_data_pd.sort_values("Purchase Count", ascending=False).head(10)
```

Out[254]:

		Purchase Count	Item Price	Total Purchase Value
Item ID	Item Name			
145	Fiery Glass Crusader	9	\$4.58	\$41.22
108	Extraction, Quickblade Of Trembling Hands	9	\$3.53	\$31.77
82	Nirvana	9	\$4.90	\$44.10
92	Final Critic	8	\$4.88	\$39.04
75	Brutality Ivory Warmace	8	\$2.42	\$19.36
59	Lightning, Etcher of the King	8	\$4.23	\$33.84
19	Pursuit, Cudgel of Necromancy	8	\$1.02	\$8.16
60	Wolf	8	\$3.54	\$28.32
34	Retribution Axe	8	\$2.22	\$17.76
72	Winter's Bite	8	\$3.77	\$30.16

In [258]:

```
#Most Profitable Items  
item_data_pd.sort_values("Total Purchase Value", ascending = False).head()
```

Out[258]:

		Purchase Count	Item Price	Total Purchase Value
Item ID	Item Name			
63	Stormfury Mace	2	\$4.99	\$9.98
29	Chaos, Ender of the End	5	\$1.98	\$9.90
173	Stormfury Longsword	2	\$4.93	\$9.86
1	Crucifer	3	\$3.26	\$9.78
38	The Void, Vengeance of Dark Magic	4	\$2.37	\$9.48

In []: