Loading Snowboard data.

This notebook is all about cleaning the snowboard data, checking some condition as per user's requrement.

- · Loaded the Snowboard data with all fields.
- · Handling of hexadecimal values.
- · Null data handling.
- · Datatype change.
- · Addressed user's requirement.
- · Discounted Damage calculation.
- Filtered the data based on the duration of each scenario.
- · Total damage calculation.
- Handing for Total Damage over 50000\$.
- Exporting the filtered data into a new .csv file, which will be used in final notebook.

```
import pandas as pd
In [ ]:
        df =pd.read csv('Low Anchor.tsv', sep='\t+',skiprows=[0,2, 4]+list(range(1,1614,2
         ))
                         + [1614], names = ['StartDate', 'EndDate',
                'ResponseType',
                'IP Address',
                'Progress',
                'Duration',
                'Finished',
                'RecordedDate',
                'ResponseID',
                'RecipientLastName', 'RecipientFirstName', 'RecipientEmail',
                'ExternalDataReference', 'LocationLatitude', 'LocationLongitude',
                'DistributionChannel', 'UserLanguage', 'Participation_in_this_project.',
                'Browser Meta Info - Browser',
                'Browser Meta Info - Version',
                'Browser Meta Info - Operating System',
                'Browser Meta Info - Resolution',
                'What number did you hear?',
                'What word did you see?',
                'What is your sex?',
                'How old are you?',
                'Which of the following best describes your ethnicity?',
                'Are you Spanish/Hispanic/Latino',
                'What is the highest degree or level of school you have completed?',
                'This is an attention check. Select 200.',
                'Which of the following best describes your total household income?',
                'Where would you place yourself on this scale?',
                'What is your zip code?',
                'Timing - First Click', 'Timing - Last Click',
                 'Timing - Page Submit', 'Timing - Click Count'
                'Timing - First Click.1', 'Timing - Last Click.1',
                'Timing - Page Submit.1',
                'Timing - Click Count.1', 'Timing - First Click.2',
                 'Timing - Last Click.2',
                'Timing - Page Submit.2','Timing - Click Count.2',
'Timing - First Click.3','Timing - Last Click.3',
                'Timing - Page Submit.3', 'Timing - Click Count.3',
                 'Timing - First Click.4', 'Timing - Last Click.4',
                'Timing - Page Submit.4', 'Timing - Click Count.4',
                 'Timing - First Click.5', 'Timing - Last Click.5',
                'Timing - Page Submit.5', 'Timing - Click Count.5',
                'Timing - First Click.6', 'Timing - Last Click.6',
                'Timing - Page Submit.6', 'Timing - Click Count.6',
                 'Timing - First Click.7', 'Timing - Last Click.7',
                'Timing - Page Submit.7', 'Timing - Click Count.7',
          'Identify the statement that correctly describes the facts of this case. (This is
          the attention check)',
                'Was_snowboard_sold_McNeil_defective_14',
                "Is substantial factor McNeil injuries 14",
                'Non economic damages McNeil suffered 14',
                'Damages words 14',
                'Was McNeil negligent',
                'McNeil_negligence_substantial_factor_for_injuries',
                'Percentage_of_responsibility_X5',
                'Percentage_of_responsibility_McNeil',
                'Was snowboard sold McNeil defective 58',
                "Is substantial factor McNeil injuries 58",
                'Economic damages McNeil suffer 58',
                'Economic_Damages_In_Word_58',
                'Non economic damages McNeil suffered 58',
```

```
'Non_Economic_Damages_In_Word_58',

'Please explain why you arrived at your decision? (50 character minimum)',

'Q40',#'Did the fact that X5 added core inserts to the later Carve 3000 mod

el, affect your view as to whether the original Carve 3000 was defective?',

'Q41', #'Were you able to ignore the fact that X5 added core inserts to th

e later Carve 3000 model when deciding whether the original Carve 3000 was defecti

ve?',

'Path'])
```

Replacing hexadecimal value of damages'/x00' to "(empty string)

The data set contains so many hexadecimal values so we have replaced them with empty string.

```
In [253]:
          for i in range(len(df)):
              df['Was_snowboard_sold_McNeil_defective_14'].values[i] = df['Was_snowboard_sold_Mc
          Neil_defective_14'].values[i].replace('\x00','')
              df['Is_substantial_factor_McNeil_injuries_14'].values[i] = df['Is_substantial_fact
          or McNeil injuries 14'].values[i].replace('\x00','')
              df['Non_economic_damages_McNeil_suffered_14'].values[i] = df['Non_economic_damages
          _McNeil_suffered_14'].values[i].replace('\x00','')
              df['Damages_words_14'].values[i] = df['Damages_words_14'].values[i].replace('\x00'
              df['Was_McNeil_negligent'].values[i] = df['Was_McNeil_negligent'].values[i].replac
          e('\x00','');
              df['McNeil_negligence_substantial_factor_for_injuries'].values[i] = df['McNeil_neg
          ligence substantial factor for injuries'].values[i].replace('\x00','');
              df['Percentage of responsibility X5'].values[i] = df['Percentage of responsibility
          _X5'].values[i].replace('\x00','');
              df['Percentage of responsibility McNeil'].values[i] = df['Percentage of responsibi
          lity_McNeil'].values[i].replace('\x00','');
              df['Was_snowboard_sold_McNeil_defective_58'].values[i] = df['Was_snowboard_sold_Mc
          Neil defective 58'].values[i].replace('\x00','');
              df['Is_substantial_factor_McNeil_injuries_58'].values[i] = df['Is_substantial_fact
          or_McNeil_injuries_58'].values[i].replace('\x00','');
              df['Economic damages McNeil suffer 58'].values[i] = df['Economic damages McNeil su
          ffer 58'].values[i].replace('\x00','');
              df['Economic_Damages_In_Word_58'].values[i] = df['Economic_Damages_In_Word_58'].va
          lues[i].replace('\x00','');
              df['Non_economic_damages_McNeil_suffered_58'].values[i] = df['Non_economic_damages
          McNeil suffered 58'].values[i].replace('\x00','');
              df['Non_Economic_Damages_In_Word_58'].values[i] = df['Non_Economic_Damages_In_Word
          _58'].values[i].replace('\x00','');
              df['Path'].values[i] = df['Path'].values[i].replace('\x00','');
              df['Q40'].values[i] = df['Q40'].values[i].replace('\x00','');
              df['Q41'].values[i] = df['Q41'].values[i].replace('\x00','');
              df['Duration'].values[i] = df['Duration'].values[i].replace('\x00','');
              df['What is the highest degree or level of school you have completed?'].values[i]
          = df['What is the highest degree or level of school you have completed?'].values[i].re
          place('\x00','');
              df['Which of the following best describes your total household income?'].values[i]
           = df['Which of the following best describes your total household income?'].values[i].
          replace('\x00','');
              #df['Was the Carve 3000 snowboard X5 sold Connor McNeil defective?'].values[i] =
           df['Was the Carve 3000 snowboard X5 sold Connor McNeil defective?'].values[i].replace
          ('\x00','');
```

After dealing with Special Character in data, lets change the Data type of required columns

```
In [254]:
          df.StartDate = pd.to datetime(df.StartDate)
          df.EndDate
                      = pd.to datetime(df.EndDate)
          #df.Was snowboard sold McNeil defective 14 = pd.to numeric(df.Was snowboard sold McN
          eil defective 14)
          df.Is substantial factor McNeil injuries 14 = pd.to numeric(df.Is substantial factor M
          cNeil injuries 14)
          df.Non economic damages McNeil suffered 14 = pd.to numeric(df.Non economic damages Mc
          Neil_suffered_14)
          df.Was McNeil negligent
                                                      = pd.to numeric(df.Was McNeil negligent)
          df.McNeil_negligence_substantial_factor_for_injuries= pd.to_numeric(df.McNeil_negligen
          ce substantial factor for injuries)
          df.Percentage of responsibility X5
                                                      = pd.to numeric(df.Percentage of responsib
          ility X5)
          df.Percentage_of_responsibility_McNeil
                                                      = pd.to_numeric(df.Percentage_of_responsib
          ility McNeil)
          #df.Was_snowboard_sold_McNeil_defective_58 = pd.to_numeric(df.Was_snowboard_sold_McN
          eil defective 58)
          df.Is_substantial_factor_McNeil_injuries_58 = pd.to_numeric(df.Is_substantial_factor_M
          cNeil injuries 58)
          df.Economic damages McNeil suffer 58
                                                      = pd.to numeric(df.Economic damages McNeil
          suffer 58)
          df.Non economic damages McNeil suffered 58 = pd.to numeric(df.Non economic damages Mc
          Neil suffered 58)
          df.Q40 =pd.to_numeric(df.Q40)
          #df.Q41 =pd.to_numeric(df.Q41)
          # Handling for Path
          df.Path = pd.to_numeric(df.Path)
          df['Path'].fillna(0,inplace = True)
          df.Duration
                      = pd.to numeric(df.Duration)
          df.Duration = df.Duration.astype(int)
          df.Path = df.Path.astype(int)
          df.dtypes
```

Out[254]: StartDate

datetime64[ns]

EndDate

datetime64[ns]

ResponseType

object

IP Address

object

Progress

. .

Duration

object

Finished

int32

RecordedDate

object

ResponseID

object

RecipientLastName

object

object

RecipientFirstName

object

RecipientEmail

object

ExternalDataReference

object

LocationLatitude

object

LocationLongitude

object

DistributionChannel

object

UserLanguage

object

Participation_in_this_project.

object

Browser Meta Info - Browser

object

Browser Meta Info - Version

object

Browser Meta Info - Operating System

object

Browser Meta Info - Resolution

object

What number did you hear?

object

What word did you see?

object

What is your sex?

object

How old are you?

object

Which of the following best describes your ethnicity?

object

Are you Spanish/Hispanic/Latino

object

What is the highest degree or level of school you have completed?

object

This is an attention check. Select 200.

object

. .

```
Timing - Last Click.5
                                 object
Timing - Page Submit.5
                                 object
Timing - Click Count.5
                                 object
Timing - First Click.6
                                 object
Timing - Last Click.6
                                 object
Timing - Page Submit.6
                                 object
Timing - Click Count.6
                                 object
Timing - First Click.7
                                 object
Timing - Last Click.7
                                 object
Timing - Page Submit.7
                                 object
Timing - Click Count.7
                                 object
Identify the statement that correctly describes the facts of this case. (This is
the attention check)
                                object
Was snowboard sold McNeil defective 14
                                 object
Is_substantial_factor_McNeil_injuries 14
Non_economic_damages_McNeil_suffered_14
                                float64
Damages words 14
                                 object
Was_McNeil_negligent
                               float64
McNeil_negligence_substantial_factor_for_injuries
                                float64
Percentage of responsibility X5
                                float64
Percentage of responsibility McNeil
                                float64
Was snowboard sold McNeil defective 58
                                 object
Is_substantial_factor_McNeil_injuries_58
                               float64
Economic damages McNeil suffer 58
                                float64
Economic Damages In Word 58
                                 object
Non_economic_damages_McNeil_suffered_58
                                float64
Non_Economic_Damages_In_Word_58
                                 object
Please explain why you arrived at your decision? (50 character minimum)
                                 object
040
                                float64
Q41
                                 object
Path
                                  int32
Length: 84, dtype: object
```

*** Note Failed parsing df.Q41 =pd.to_numeric(df.Q41) Checked the data It has one invalid row '1,3'

```
In [255]: df.Q41.unique()
Out[255]: array(['', '3', '1', '"1,3"'], dtype=object)
```

Extracting the required columns and storing it in "newdf" data frame.

```
newdf =pd.DataFrame(df[['StartDate', 'EndDate', 'Duration',
In [256]:
                  'Was snowboard sold McNeil defective 14',
                  "Is_substantial_factor_McNeil_injuries_14",
                  'Non_economic_damages_McNeil_suffered_14',
                  'Was_McNeil_negligent',
                  'McNeil_negligence_substantial_factor_for_injuries',
                  'Percentage_of_responsibility_X5',
                  'Percentage of responsibility McNeil'
                  'Was_snowboard_sold_McNeil_defective_58',
                  "Is substantial factor McNeil injuries 58",
                  'Economic_damages_McNeil_suffer_58',
                  'Non_economic_damages_McNeil_suffered_58',
                  'Q40',
                  'Q41',
                  'Path',
                  'What is the highest degree or level of school you have completed?',
                  'Which of the following best describes your total household income?',
                                  ]])
          newdf.sample(5)
```

Out[256]:

	StartDate	EndDate	Duration	Was_snowboard_sold_McNeil_defective_14	ls_substantial_fact
643	2018-04- 06 13:31:00	2018-04- 06 14:03:00	1925	4	5.0
118	2018-04- 06 13:18:00	2018-04- 06 13:38:00	1207	4	5.0
612	2018-04- 06 13:20:00	2018-04- 06 14:00:00	2407		NaN
715	2018-04- 06 14:06:00	2018-04- 06 14:27:00	1237	4	6.0
738	2018-04- 06 14:14:00	2018-04- 06 14:33:00	1109	6	NaN

Handling Percentage Calculation

We have two columns that save the percentage of responsibility for X5 and McNeil. The total sum should be 100. If it is less than 100 or greater than 100, then we need to change to a relative percentage, so that it should be round to 100.

Let's see what are the data in these columns and if there are any null/NaN values, then we have to deal with that.

```
print("Unique values for X5 ", newdf.Percentage of responsibility X5.unique())
In [258]:
          print("Unique values for _McNiel ", newdf.Percentage_of_responsibility_McNeil.unique
          ())
          Unique values for _X5 [ nan 50. 65. 75. 90. 80.
                                                               70.
                                                                    25.
                                                                         60.
                                                                              40.
                                                                                   20.
                                                                                      15.
           35. 85. 55. 100. 45.
                                    30.]
          Unique values for _McNiel [nan 50. 35. 25. 10. 20. 30. 75. 40. 60. 80. 85. 95. 90. 6
          5. 15. 45. 0.
          55. 70.]
```

In Both the columns, we have NaN values. Before replacing NaN with 0s, lets first check which rows have 0 values.

```
In [259]: newdf.query("Percentage_of_responsibility_McNeil == 0")
```

Out[259]:

	StartDate	EndDate	Duration	Was_snowboard_sold_McNeil_defective_14	Is_substantial_fact
510	06	2018-04- 06 13:53:00	136		NaN

As there is one row with 0 value, we are replacing NaN with some nagative values say '-1'.

Lets see the distribution of total percentage.

So for all cases each percentage are summing to 100 and there is no "Total Percentage" greater than or less than 100.

Lets convert the value to % for calculation of discounted damages and replacinng -ve value with 1.

```
In [262]:
          newdf['Percentage_of_responsibility_X5']=newdf['Percentage_of_responsibility_X5']/100
          newdf['Percentage of responsibility X5'].replace([-0.01],[1], inplace = True)
          newdf['Percentage of responsibility McNeil']=newdf['Percentage of responsibility McNei
          1']/100
          newdf['Percentage_of_responsibility_McNeil'].replace([-0.01],[1], inplace = True)
          print(newdf['Percentage of responsibility McNeil'].head())
          print(newdf['Percentage of responsibility X5'].head())
          0
               1.0
          1
               1.0
          2
               1.0
               1.0
               1.0
          Name: Percentage of responsibility McNeil, dtype: float64
               1.0
          1
               1.0
          2
               1.0
          3
               1.0
               1.0
          Name: Percentage of responsibility X5, dtype: float64
```

See how many missing data points we have

Ok, now we know that we do have some missing values. Let's see how many we have in each column.

```
In [263]:
          import numpy as np
          missing values count = newdf.isnull().sum()
          print(missing values count)
          total cells = np.product(newdf.shape)
          total missing = missing values count.sum()
          print('Percent of data that is missing: ',(total_missing/total_cells) * 100)
                                                                   0
          StartDate
          EndDate
                                                                   0
          Duration
                                                                   0
          Was snowboard sold McNeil defective 14
                                                                   0
          Is_substantial_factor_McNeil_injuries_14
                                                                 618
          Non_economic_damages_McNeil_suffered_14
                                                                 637
          Was McNeil negligent
                                                                 489
          McNeil negligence substantial factor for injuries
                                                                 489
          Percentage of responsibility X5
                                                                   0
          Percentage_of_responsibility_McNeil
                                                                   0
          Was snowboard sold McNeil defective 58
                                                                   0
          Is substantial factor McNeil injuries 58
                                                                 629
          Economic_damages_McNeil_suffer_58
                                                                 656
          Non_economic_damages_McNeil_suffered_58
                                                                 656
          Q40
                                                                  33
          Q41
                                                                   0
          Path
                                                                   0
          Education
                                                                   0
          Income
                                                                   0
          Total perc
                                                                   0
          dtype: int64
          Percent of data that is missing: 26.162935323383085
In [264]:
          newdf.shape
Out[264]: (804, 20)
In [265]:
          newdf.dtypes
Out[265]: StartDate
                                                                 datetime64[ns]
          EndDate
                                                                 datetime64[ns]
          Duration
                                                                          int32
          Was_snowboard_sold_McNeil_defective_14
                                                                         object
          Is substantial factor McNeil injuries 14
                                                                        float64
          Non economic damages McNeil suffered 14
                                                                        float64
          Was McNeil negligent
                                                                        float64
          McNeil negligence substantial factor for injuries
                                                                        float64
          Percentage_of_responsibility_X5
                                                                        float64
          Percentage_of_responsibility_McNeil
                                                                        float64
          Was snowboard sold McNeil defective 58
                                                                         object
          Is_substantial_factor_McNeil_injuries_58
                                                                        float64
          Economic_damages_McNeil_suffer 58
                                                                        float64
          Non economic damages McNeil suffered 58
                                                                        float64
          Q40
                                                                        float64
          041
                                                                         object
          Path
                                                                          int32
          Education
                                                                         object
          Income
                                                                         object
          Total perc
                                                                        float64
          dtype: object
```

As we are just working on from path 1 to 8, Lets remove path with value 0.

So the number of rows to be removed having Path as 0 can be checked usig the ".shape"

In [266]: newdf[newdf.Path <=0].shape</pre>

Out[266]: (13, 20)

So we have 13 rows. Let's have a look on those rows.

In [267]:

newdf[newdf.Path <=0].head()</pre>

Out[267]:

	StartDate	EndDate	Duration	Was_snowboard_sold_McNeil_defective_14	ls_substantial_factor
0	2018-04- 06 13:14:00	2018-04- 06 13:15:00	34		NaN
1	2018-04- 06 13:15:00	2018-04- 06 13:16:00	42		NaN
3	2018-04- 06 13:17:00	2018-04- 06 13:18:00	69		NaN
5	2018-04- 06 13:19:00	2018-04- 06 13:19:00	14		NaN
6	2018-04- 06 13:17:00	2018-04- 06 13:20:00	197		NaN

 As we can see there are 13 observation with path value equal to 0. We are removing these observation

In [268]: newdf = newdf[newdf.Path > 0]

Filter the data based on the duration of each scenario

As per the requirement we have to filter the experiment one data based on the length of each scenario. The lengths are as follows:

- Scenario 1 14:47 (887 seconds)
- Scenario 2 15:11 (911 seconds)
- Scenario 3 15:50 (950 seconds)
- Scenario 4 16:23 (983 seconds)
- Scenario 5 16:37 (997 seconds
- Scenario 6 16:56 (1016 seconds)
- Scenario 7 17:40 (1060 seconds)
- Senario 8 18:04 (1084 seconds)

Let's filter anyone who spent less than 10 second less than the whole time. e.g 14:37(877), 15:01(901) etc.

```
In [270]: newdf.head()
```

Out[270]:

	StartDate	EndDate	Duration	Was_snowboard_sold_McNeil_defective_14	ls_substantial_facto
25	2018-04- 06 13:15:00	2018-04- 06 13:32:00	1039		NaN
26	2018-04- 06 13:17:00	2018-04- 06 13:33:00	915	4	6.0
27	2018-04- 06 13:15:00	2018-04- 06 13:33:00	1051	4	5.0
28	2018-04- 06 13:15:00	2018-04- 06 13:33:00	1092	6	NaN
29	2018-04- 06 13:14:00	2018-04- 06 13:33:00	1135	4	5.0

Replacing the Null Values with empty string(Easy to convert to other datatypes Later)

```
In [271]: print(pd.isnull(newdf).any())
          newdf = newdf[np.isfinite(newdf['Path'])]
          newdf['Is_substantial_factor_McNeil_injuries_14'].fillna("",inplace=True)
          newdf['Non_economic_damages_McNeil_suffered_14'].fillna("",inplace=True)
          newdf['Was McNeil negligent'].fillna("",inplace=True)
          newdf['McNeil negligence substantial factor for injuries'].fillna("",inplace=True)
          newdf['Percentage_of_responsibility_X5'].fillna("",inplace=True)
          newdf['Percentage_of_responsibility_McNeil'].fillna("",inplace=True)
          newdf['Was_snowboard_sold_McNeil_defective_58'].fillna("",inplace=True)
          newdf['Is substantial factor McNeil injuries 58'].fillna("",inplace=True)
          newdf['Economic damages McNeil suffer 58'].fillna("",inplace=True)
          newdf['Non_economic_damages_McNeil_suffered_58'].fillna("",inplace=True)
          newdf['Q40'].fillna("",inplace=True)
          newdf['Q41'].fillna("",inplace=True)
          # Printing the first 5 lines.
          #print(newdf.head(5))
```

```
StartDate
                                                       False
EndDate
                                                       False
Duration
                                                       False
Was_snowboard_sold_McNeil_defective_14
                                                       False
Is substantial factor McNeil injuries 14
                                                        True
Non_economic_damages_McNeil_suffered_14
                                                        True
Was McNeil negligent
                                                        True
McNeil negligence substantial factor for injuries
                                                        True
Percentage of responsibility X5
                                                       False
Percentage of responsibility McNeil
                                                       False
Was snowboard sold McNeil defective 58
                                                       False
Is substantial factor McNeil injuries 58
                                                        True
Economic damages McNeil suffer 58
                                                        True
Non economic damages McNeil suffered 58
                                                        True
Q40
                                                        True
041
                                                       False
Path
                                                       False
Education
                                                       False
Income
                                                       False
Total perc
                                                       False
dtype: bool
```

Graph showing the responses of jurors for each path(1-8)

There are two separate columns in our dataset having the juror response.

- Was_snowboard_sold_McNeil_defective_14: keeping response from path 1 to 4
- Was_snowboard_sold_McNeil_defective_58 : keeping response from path 5 to 8

For plotting a single graph for all the path, we merge these two columns into a new column called "Liability".

Liability columns have numeric values. We have replaced it with 4 for 'Yes' and 6 for 'No'. Liability with blank is dropped.

```
In [273]: newdf['Liability'].replace('', np.nan, inplace=True)
    newdf.dropna(subset=['Liability'], inplace=True)
    newdf['Liability'].replace(['4', '6'], ['Yes','No'], inplace = True)
    newdf.Liability.unique()

Out[273]: array(['No', 'Yes'], dtype=object)
```

Total Damage Calculation

For the box plot, we need to replace the empty string with 0. But before Filling the NaN values with 0, lets first check if any juror has put 0 intentionally.

We need to change the data type of damages. There are 3 different columns that have the damages information. From previous data type check, we found that there are so many missing values for damages. So we replaced them with 0.

For simplicity to plot Path vs damages we combined all damages into one column and named it as "Total Damages".

```
In [275]: newdf.query('Non_economic_damages_McNeil_suffered_14 == 0 | Non_economic_damages_McNei
l_suffered_58 == 0 | Economic_damages_McNeil_suffer_58 ==0')
```

Out[275]:

	StartDate	EndDate	Duration	Was_snowboard_sold_McNeil_defective_14	ls_substantial_fact
246	06	2018-04- 06 13:42:00	1404		

¹ rows × 21 columns

We found that one row has 0 value for Non_economic damages McNeil suffered.

Lets see how many rows have Total Damage as 0.

```
In [277]: (newdf.Total_Damages==0).sum()
Out[277]: 435
```

As per requirement Damages above 500000 should be converted to 500000.

As per user's requirement we need to discount the percentage X5 responsible from the Total Damages.

As we need to check if juror education and Income has any impact while awarding liability, we included there two fields in the data frame.

Saving the file to CSV so that we can use in the other notebook.

```
In [285]: newdf.to_csv("cleaning.csv",sep=',')
```