

In [2]:

```
# TODO: Read data.
import pandas as pd
TWITTER = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/TWITTER.csv')
```

In [3]:

```
# TODO: Create separate dataset for each Stock.
ADI = TWITTER.loc[TWITTER['#RIC'] == 'ADI.OQ']
FID = TWITTER.loc[TWITTER['#RIC'] == 'FIS.N']
FIS = TWITTER.loc[TWITTER['#RIC'] == 'FISV.OQ']
GPN = TWITTER.loc[TWITTER['#RIC'] == 'GPN.N']
JUN = TWITTER.loc[TWITTER['#RIC'] == 'JNPR.N']
```

In [4]:

```
# TODO: Delete wuotes.
ADIA = ADI[ADI.Type != 'Quote']
FIDA = FID[FID.Type != 'Quote']
FISA = FIS[FIS.Type != 'Quote']
GPNA = GPN[GPN.Type != 'Quote']
JUNA = JUN[JUN.Type != 'Quote']
```

In [5]:

```
# TODO: Keep some columns.
ADIB = ADIA[['#RIC', 'Date-Time', 'Price', 'Volume', 'Exch Time']]
FIDB = FIDA[['#RIC', 'Date-Time', 'Price', 'Volume', 'Exch Time']]
FISB = FISA[['#RIC', 'Date-Time', 'Price', 'Volume', 'Exch Time']]
GPNB = GPNA[['#RIC', 'Date-Time', 'Price', 'Volume', 'Exch Time']]
JUNB = JUNA[['#RIC', 'Date-Time', 'Price', 'Volume', 'Exch Time']]
```

In [6]:

```
# TODO: Read Twitter data.
TWITTERADI = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/ADI.csv')
TWITTERFID = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/Fidelity.csv')
TWITTERFIS = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/Fiserv.csv')
TWITTERGPN = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/Global.csv')
TWITTERJUN = pd.read_csv('/Users/khaladdin/Desktop/Twitter Project/Juniper.csv')
```

In [7]:

```
# TODO: Keep some columns.
TWITTERADIA = TWITTERADI[['Row ID', 'Date', 'Datetime', 'Number of Retweets']]
TWITTERFIDA = TWITTERFID[['Row ID', 'Date', 'Datetime', 'Number of Retweets']]
TWITTERFISA = TWITTERFIS[['Row ID', 'Date', 'Datetime', 'Number of Retweets']]
TWITTERGPNa = TWITTERGPN[['Row ID', 'Date', 'Datetime', 'Number of Retweets']]
TWITTERJUNa = TWITTERJUN[['Row ID', 'Date', 'Datetime', 'Number of Retweets']]
```

In [8]:

```
# TODO: Change the format of datetime.
ADIB['Date'] = pd.to_datetime(ADIB['Date-Time'])
FIDb['Date'] = pd.to_datetime(FIDb['Date-Time'])
FISb['Date'] = pd.to_datetime(FISb['Date-Time'])
GPNb['Date'] = pd.to_datetime(GPNb['Date-Time'])
JUNb['Date'] = pd.to_datetime(JUNb['Date-Time'])
```

```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """Entry point for launching an IPython kernel.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    This is separate from the ipykernel package so we can avoid doin
g imports until
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    after removing the cwd from sys.path.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """

```

In [9]:

```

# TODO: Change the format of datetime.
ADIB['Date1'] = ADIB['Date'].dt.date
FIDb['Date1'] = FIDb['Date'].dt.date
FISb['Date1'] = FISb['Date'].dt.date
GPNb['Date1'] = GPNb['Date'].dt.date
JUNb['Date1'] = JUNb['Date'].dt.date

```

```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """Entry point for launching an IPython kernel.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    This is separate from the ipykernel package so we can avoid doin
g imports until
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    after removing the cwd from sys.path.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """

```

In [10]:

```
# TODO: Change the format of datetime.
TWITTERADIA['Date'] = pd.to_datetime(TWITTERADIA['Date'], format='%d/%m/%Y')
TWITTERFIDA['Date'] = pd.to_datetime(TWITTERFIDA['Date'], format='%d/%m/%Y')
TWITTERFISA['Date'] = pd.to_datetime(TWITTERFISA['Date'], format='%d/%m/%Y')
TWITTERGPNA['Date'] = pd.to_datetime(TWITTERGPNA['Date'], format='%d/%m/%Y')
TWITTERJUNA['Date'] = pd.to_datetime(TWITTERJUNA['Date'], format='%d/%m/%Y')
```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""Entry point for launching an IPython kernel.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

This is separate from the ipykernel package so we can avoid doing imports until

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

after removing the cwd from sys.path.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""

In [11]:

```
# TODO: Change the format of datetime.
TWITTERADIA['Date1'] = TWITTERADIA['Date'].dt.date
TWITTERFIDA['Date1'] = TWITTERFIDA['Date'].dt.date
TWITTERFISA['Date1'] = TWITTERFISA['Date'].dt.date
TWITTERGPNa['Date1'] = TWITTERGPNa['Date'].dt.date
TWITTERJUNA['Date1'] = TWITTERJUNA['Date'].dt.date
```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""Entry point for launching an IPython kernel.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

This is separate from the ipykernel package so we can avoid doing imports until

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

after removing the cwd from sys.path.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""

In [12]:

```
# TODO: Merge datasets.
ADIC = pd.merge(ADIB, TWITTERADIA, on='Date1', how='outer')
FIDC = pd.merge(FIDB, TWITTERFIDA, on='Date1', how='outer')
FISC = pd.merge(FISB, TWITTERFISA, on='Date1', how='outer')
GPNC = pd.merge(GPNB, TWITTERGPNA, on='Date1', how='outer')
JUNC = pd.merge(JUNB, TWITTERJUNA, on='Date1', how='outer')
```

In [13]:

```
# TODO: Change the format of datetime.
ADIC['Time'] = pd.to_datetime(ADIC['Datetime'])
FIDC['Time'] = pd.to_datetime(FIDC['Datetime'])
FISC['Time'] = pd.to_datetime(FISC['Datetime'])
GPNC['Time'] = pd.to_datetime(GPNC['Datetime'])
JUNC['Time'] = pd.to_datetime(JUNC['Datetime'])
```

In [14]:

```
# TODO: Change the format of datetime.
ADIC['Timedir'] = ADIC['Time'].dt.time
FIDC['Timedir'] = FIDC['Time'].dt.time
FISC['Timedir'] = FISC['Time'].dt.time
GPNC['Timedir'] = GPNC['Time'].dt.time
JUNC['Timedir'] = JUNC['Time'].dt.time
```

In [15]:

```
# TODO: Change the format of datetime. THESE FORMAT CHANGING ARE IMPORTANT SINCE I NEED TO FIND THE NEAREST TWIT TRADE
ADIC['Exch Time'] = pd.to_datetime(ADIC['Exch Time'])
FIDC['Exch Time'] = pd.to_datetime(FIDC['Exch Time'])
FISC['Exch Time'] = pd.to_datetime(FISC['Exch Time'])
GPNC['Exch Time'] = pd.to_datetime(GPNC['Exch Time'])
JUNC['Exch Time'] = pd.to_datetime(JUNC['Exch Time'])
```

In [16]:

```
# TODO: Delete microseconds part.
ADIC['Exch Time'] = ADIC['Exch Time'].apply(lambda x: x.replace(microsecond=0))
FIDC['Exch Time'] = FIDC['Exch Time'].apply(lambda x: x.replace(microsecond=0))
FISC['Exch Time'] = FISC['Exch Time'].apply(lambda x: x.replace(microsecond=0))
GPNC['Exch Time'] = GPNC['Exch Time'].apply(lambda x: x.replace(microsecond=0))
JUNC['Exch Time'] = JUNC['Exch Time'].apply(lambda x: x.replace(microsecond=0))
```

In [17]:

```
# TODO: Change the format of datetime.
ADIC['Timedir1'] = ADIC['Exch Time'].dt.time
FIDC['Timedir1'] = FIDC['Exch Time'].dt.time
FISC['Timedir1'] = FISC['Exch Time'].dt.time
GPNC['Timedir1'] = GPNC['Exch Time'].dt.time
JUNC['Timedir1'] = JUNC['Exch Time'].dt.time
```

In [18]:

```
# TODO: Compute the difference between Trade Time and Twit time.
ADIC['diff'] = (pd.to_timedelta(ADIC['Timedir1'].astype(str)) -
               pd.to_timedelta(ADIC['Timedir'].astype(str)))
FIDC['diff'] = (pd.to_timedelta(FIDC['Timedir1'].astype(str)) -
               pd.to_timedelta(FIDC['Timedir'].astype(str)))
FISC['diff'] = (pd.to_timedelta(FISC['Timedir1'].astype(str)) -
               pd.to_timedelta(FISC['Timedir'].astype(str)))
GPNC['diff'] = (pd.to_timedelta(GPNC['Timedir1'].astype(str)) -
               pd.to_timedelta(GPNC['Timedir'].astype(str)))
JUNC['diff'] = (pd.to_timedelta(JUNC['Timedir1'].astype(str)) -
               pd.to_timedelta(JUNC['Timedir'].astype(str)))
```

In [19]:

```
# TODO: Delete some part of characters in each string. I did it because I want
to delete if there is more than one minute between twit and trade.
ADIC['a'] = ADIC['diff'].astype(str).str[:1]
FIDC['a'] = FIDC['diff'].astype(str).str[:1]
FISC['a'] = FISC['diff'].astype(str).str[:1]
GPNC['a'] = GPNC['diff'].astype(str).str[:1]
JUNC['a'] = JUNC['diff'].astype(str).str[:1]
```

In [20]:

```
# TODO: Delete some part of characters in each string. I did it because I want
to delete if there is more than one minute between twit and trade.
ADIC = ADIC[~ADIC['a'].str.contains('\-')]
FIDC = FIDC[~FIDC['a'].str.contains('\-')]
FISC = FISC[~FISC['a'].str.contains('\-')]
GPNC = GPNC[~GPNC['a'].str.contains('\-')]
JUNC = JUNC[~JUNC['a'].str.contains('\-')]
```

In [21]:

```
# TODO: Delete some part of characters in each string. I did it because I want
to delete if there is more than one minute between twit and trade.
ADIC['diff1'] = ADIC['diff'].astype(str).str[:-10]
FIDC['diff1'] = FIDC['diff'].astype(str).str[:-10]
FISC['diff1'] = FISC['diff'].astype(str).str[:-10]
GPNC['diff1'] = GPNC['diff'].astype(str).str[:-10]
JUNC['diff1'] = JUNC['diff'].astype(str).str[:-10]
```


In [22]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC['diff11'] = ADIC['diff1'].astype(str).str[-8:]  
FIDc['diff11'] = FIDc['diff1'].astype(str).str[-8:]  
FISc['diff11'] = FISc['diff1'].astype(str).str[-8:]  
GPNC['diff11'] = GPNC['diff1'].astype(str).str[-8:]  
JUNC['diff11'] = JUNC['diff1'].astype(str).str[-8:]
```

In [23]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC['diff111'] = ADIC['diff11'].astype(str).str[:2]  
FIDc['diff111'] = FIDc['diff11'].astype(str).str[:2]  
FISc['diff111'] = FISc['diff11'].astype(str).str[:2]  
GPNC['diff111'] = GPNC['diff11'].astype(str).str[:2]  
JUNC['diff111'] = JUNC['diff11'].astype(str).str[:2]
```

In [24]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC[['diff111']] = ADIC[['diff111']].apply(pd.to_numeric)  
FIDc[['diff111']] = FIDc[['diff111']].apply(pd.to_numeric)  
FISc[['diff111']] = FISc[['diff111']].apply(pd.to_numeric)  
GPNC[['diff111']] = GPNC[['diff111']].apply(pd.to_numeric)  
JUNC[['diff111']] = JUNC[['diff111']].apply(pd.to_numeric)
```

In [25]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC = ADIC[~(ADIC['diff111'] > 0)]  
FIDc = FIDc[~(FIDc['diff111'] > 0)]  
FISc = FISc[~(FISc['diff111'] > 0)]  
GPNC = GPNC[~(GPNC['diff111'] > 0)]  
JUNC = JUNC[~(JUNC['diff111'] > 0)]
```

In [26]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC['diff1111'] = ADIC['diff11'].astype(str).str[:-3]  
FIDc['diff1111'] = FIDc['diff11'].astype(str).str[:-3]  
FISc['diff1111'] = FISc['diff11'].astype(str).str[:-3]  
GPNC['diff1111'] = GPNC['diff11'].astype(str).str[:-3]  
JUNC['diff1111'] = JUNC['diff11'].astype(str).str[:-3]
```

In [27]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC['diff11111'] = ADIC['diff11111'].astype(str).str[-2:]  
FIDc['diff11111'] = FIDc['diff11111'].astype(str).str[-2:]  
FISc['diff11111'] = FISc['diff11111'].astype(str).str[-2:]  
GPNC['diff11111'] = GPNC['diff11111'].astype(str).str[-2:]  
JUNC['diff11111'] = JUNC['diff11111'].astype(str).str[-2:]
```

In [28]:

```
# TODO: Delete some part of characters in each string. I did it because I want  
to delete if there is more than one minute between twit and trade.  
ADIC = ADIC[ADIC.diff11111 == '00']  
FIDc = FIDc[FIDc.diff11111 == '00']  
FISc = FISc[FISc.diff11111 == '00']  
GPNC = GPNC[GPNC.diff11111 == '00']  
JUNC = JUNC[JUNC.diff11111 == '00']
```

In [29]:

```
# TODO: Delete missing.  
import numpy as np  
ADIC = ADIC[np.isfinite(ADIC['diff111'])]  
FIDc = FIDc[np.isfinite(FIDc['diff111'])]  
FISc = FISc[np.isfinite(FISc['diff111'])]  
GPNC = GPNC[np.isfinite(GPNC['diff111'])]  
JUNC = JUNC[np.isfinite(JUNC['diff111'])]
```

In [30]:

```
# TODO: Create a column which value is 0 in all rows.  
ADIC['TWITRADE'] = 0  
FIDc['TWITRADE'] = 0  
FISc['TWITRADE'] = 0  
GPNC['TWITRADE'] = 0  
JUNC['TWITRADE'] = 0
```

In [31]:

```
# TODO: Create hour and minute group.  
ADIC['group'] = ADIC['Timedir1'].astype(str).str[:-3]  
FIDc['group'] = FIDc['Timedir1'].astype(str).str[:-3]  
FISc['group'] = FISc['Timedir1'].astype(str).str[:-3]  
GPNC['group'] = GPNC['Timedir1'].astype(str).str[:-3]  
JUNC['group'] = JUNC['Timedir1'].astype(str).str[:-3]
```

In [32]:

```
# TODO: Twittrade columns value (0) convert to 1 if it is the nearest trade to  
o twit. So,  
# TODO: Twittrade = 1 means that this trade might be related with twit  
ADIC.loc[ADIC.groupby('group',as_index=False).head(1).index,'TWITRADE'] = 1  
FIDC.loc[FIDC.groupby('group',as_index=False).head(1).index,'TWITRADE'] = 1  
FISC.loc[FISC.groupby('group',as_index=False).head(1).index,'TWITRADE'] = 1  
GPNC.loc[GPNC.groupby('group',as_index=False).head(1).index,'TWITRADE'] = 1  
JUNC.loc[JUNC.groupby('group',as_index=False).head(1).index,'TWITRADE'] = 1
```

In [33]:

```
# TODO: Create new index.  
ADIC.reset_index(level=0, inplace=True)  
FIDC.reset_index(level=0, inplace=True)  
FISC.reset_index(level=0, inplace=True)  
GPNC.reset_index(level=0, inplace=True)  
JUNC.reset_index(level=0, inplace=True)
```

In [34]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade  
ADII = ADIC.loc[ADIC.TWITRADE.eq(1)].index.tolist()  
ADIj = [(ADII_-5,ADII_+5) for ADII_ in ADII ]  
FIDI = FIDC.loc[FIDC.TWITRADE.eq(1)].index.tolist()  
FIDj = [(FIDI_-5,FIDI_+5) for FIDI_ in FIDI ]  
FISI = FISC.loc[FISC.TWITRADE.eq(1)].index.tolist()  
FISj = [(FISI_-5,FISI_+5) for FISI_ in FISI ]  
GPNI = GPNC.loc[GPNC.TWITRADE.eq(1)].index.tolist()  
GPNj = [(GPNI_-5,GPNI_+5) for GPNI_ in GPNI ]  
JUNI = JUNC.loc[JUNC.TWITRADE.eq(1)].index.tolist()  
JUNj = [(JUNI_-5,JUNI_+5) for JUNI_ in JUNI ]
```

In [35]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade  
ADIC.loc[ADIC.TWITRADE.eq(1), 'PERMANENTIMPACT'] = [((ADIC.Price.iloc[b] - ADI  
c.Price.iloc[a])/ADIC.Price.iloc[a]) for (a,b) in ADIj]  
FIDC.loc[FIDC.TWITRADE.eq(1), 'PERMANENTIMPACT'] = [((FIDC.Price.iloc[b] - FID  
c.Price.iloc[a])/FIDC.Price.iloc[a]) for (a,b) in FIDj]  
JUNC.loc[JUNC.TWITRADE.eq(1), 'PERMANENTIMPACT'] = [((JUNC.Price.iloc[b] - JUN  
c.Price.iloc[a])/JUNC.Price.iloc[a]) for (a,b) in JUNj]
```

In [36]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade  
FISC.loc[FISC.TWITRADE.eq(1), 'PERMANENTIMPACT'] = [((FISC.Price.iloc[b] - FIS  
c.Price.iloc[a])/FISC.Price.iloc[a]) for (a,b) in FISj]  
GPNC.loc[GPNC.TWITRADE.eq(1), 'PERMANENTIMPACT'] = [((GPNC.Price.iloc[b] - GPN  
c.Price.iloc[a])/GPNC.Price.iloc[a]) for (a,b) in GPNj]
```

In [37]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
ADII = ADIC.loc[ADIC.TWITRADE.eq(1)].index.tolist()
ADIj = [(ADII_-0,ADII_+5) for ADII_ in ADII ]
FIDI = FIDC.loc[FIDC.TWITRADE.eq(1)].index.tolist()
FIDj = [(FIDI_-0,FIDI_+5) for FIDI_ in FIDI ]
FISI = FISc.loc[FISc.TWITRADE.eq(1)].index.tolist()
FISj = [(FISI_-0,FISI_+4) for FISI_ in FISI ]
GPNi = GPNC.loc[GPNC.TWITRADE.eq(1)].index.tolist()
GPNj = [(GPNi_-0,GPNi_+1) for GPNi_ in GPNi ]
JUNi = JUNC.loc[JUNC.TWITRADE.eq(1)].index.tolist()
JUNj = [(JUNi_-0,JUNi_+5) for JUNi_ in JUNi ]
```

In [38]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
ADIC.loc[ADIC.TWITRADE.eq(1), 'TEMPORARYIMPACT'] = [((ADIC.Price.iloc[b] - ADI
c.Price.iloc[a])/ADIC.Price.iloc[a]) for (a,b) in ADIj]
FIDC.loc[FIDC.TWITRADE.eq(1), 'TEMPORARYIMPACT'] = [((FIDC.Price.iloc[b] - FID
c.Price.iloc[a])/FIDC.Price.iloc[a]) for (a,b) in FIDj]
JUNC.loc[JUNC.TWITRADE.eq(1), 'TEMPORARYIMPACT'] = [((JUNC.Price.iloc[b] - JUN
c.Price.iloc[a])/JUNC.Price.iloc[a]) for (a,b) in JUNj]
```

In [39]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
FISc.loc[FISc.TWITRADE.eq(1), 'TEMPORARYIMPACT'] = [((FISc.Price.iloc[b] - FIS
c.Price.iloc[a])/FISc.Price.iloc[a]) for (a,b) in FISj]
GPNC.loc[GPNC.TWITRADE.eq(1), 'TEMPORARYIMPACT'] = [((GPNC.Price.iloc[b] - GPN
c.Price.iloc[a])/GPNC.Price.iloc[a]) for (a,b) in GPNj]
```

In [40]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
ADII = ADIC.loc[ADIC.TWITRADE.eq(1)].index.tolist()
ADIj = [(ADII_-5,ADII_+0) for ADII_ in ADII ]
FIDI = FIDC.loc[FIDC.TWITRADE.eq(1)].index.tolist()
FIDj = [(FIDI_-5,FIDI_+0) for FIDI_ in FIDI ]
FISI = FISc.loc[FISc.TWITRADE.eq(1)].index.tolist()
FISj = [(FISI_-5,FISI_+0) for FISI_ in FISI ]
GPNi = GPNC.loc[GPNC.TWITRADE.eq(1)].index.tolist()
GPNj = [(GPNi_-5,GPNi_+0) for GPNi_ in GPNi ]
JUNi = JUNC.loc[JUNC.TWITRADE.eq(1)].index.tolist()
JUNj = [(JUNi_-5,JUNi_+0) for JUNi_ in JUNi ]
```

In [41]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
ADIC.loc[ADIC.TWITRADE.eq(1), 'TOTALIMPACT'] = [((ADIC.Price.iloc[b] - ADIC.Pr
ice.iloc[a])/ADIC.Price.iloc[a]) for (a,b) in ADIj]
FIDc.loc[FIDc.TWITRADE.eq(1), 'TOTALIMPACT'] = [((FIDc.Price.iloc[b] - FIDc.Pr
ice.iloc[a])/FIDc.Price.iloc[a]) for (a,b) in FIDj]
JUNc.loc[JUNc.TWITRADE.eq(1), 'TOTALIMPACT'] = [((JUNc.Price.iloc[b] - JUNc.Pr
ice.iloc[a])/JUNc.Price.iloc[a]) for (a,b) in JUNj]
```

In [42]:

```
# TODO: Compute permanent, temporary and total impact for Twittrade
FISc.loc[FISc.TWITRADE.eq(1), 'TOTALIMPACT'] = [((FISc.Price.iloc[b] - FISc.Pr
ice.iloc[a])/FISc.Price.iloc[a]) for (a,b) in FISj]
GPNC.loc[GPNC.TWITRADE.eq(1), 'TOTALIMPACT'] = [((GPNC.Price.iloc[b] - GPNC.Pr
ice.iloc[a])/GPNC.Price.iloc[a]) for (a,b) in GPNj]
```

In [43]:

```
# TODO: Keep only twittrade colum
ADId = ADIC[ADIC.TWITRADE.eq(1)]
FIDd = FIDc[FIDc.TWITRADE.eq(1)]
FISd = FISc[FISc.TWITRADE.eq(1)]
GPNd = GPNC[GPNC.TWITRADE.eq(1)]
JUNd = JUNc[JUNc.TWITRADE.eq(1)]
```

In [44]:

```
# TODO: Compute permanent impact for ALL trade
ADIA['Permanent'] = (ADIA.Price.shift(-5)-ADIA.Price.shift(5))/ADIA.Price.shif
t(5)
FIDA['Permanent'] = (FIDA.Price.shift(-5)-FIDA.Price.shift(5))/FIDA.Price.shif
t(5)
FISA['Permanent'] = (FISA.Price.shift(-5)-FISA.Price.shift(5))/FISA.Price.shif
t(5)
GPNA['Permanent'] = (GPNA.Price.shift(-5)-GPNA.Price.shift(5))/GPNA.Price.shif
t(5)
JUNA['Permanent'] = (JUNA.Price.shift(-5)-JUNA.Price.shift(5))/JUNA.Price.shif
t(5)
```

```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """Entry point for launching an IPython kernel.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    This is separate from the ipykernel package so we can avoid doin
g imports until
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    after removing the cwd from sys.path.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pan
das-docs/stable/indexing.html#indexing-view-versus-copy
    """

```

In [45]:

```
# TODO: Compute temporary impact for ALL trade
ADIA['Temporary'] = (ADIA.Price.shift(-5)-ADIA.Price.shift(0))/ADIA.Price.shif
t(0)
FIDA['Temporary'] = (FIDA.Price.shift(-5)-FIDA.Price.shift(0))/FIDA.Price.shif
t(0)
FISA['Temporary'] = (FISA.Price.shift(-5)-FISA.Price.shift(0))/FISA.Price.shif
t(0)
GPNA['Temporary'] = (GPNA.Price.shift(-5)-GPNA.Price.shift(0))/GPNA.Price.shif
t(0)
JUNA['Temporary'] = (JUNA.Price.shift(-5)-JUNA.Price.shift(0))/JUNA.Price.shif
t(0)
```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: Se
ttingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""Entry point for launching an IPython kernel.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: Se
ttingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: Se
ttingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

This is separate from the ipykernel package so we can avoid doin
g imports until

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: Se
ttingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

after removing the cwd from sys.path.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: Se
ttingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""

In [46]:

```
# TODO: Compute total impact for ALL trade
ADIA['Total'] = (ADIA.Price.shift(0)-ADIA.Price.shift(5))/ADIA.Price.shift(5)
FIDA['Total'] = (FIDA.Price.shift(0)-FIDA.Price.shift(5))/FIDA.Price.shift(5)
FISA['Total'] = (FISA.Price.shift(0)-FISA.Price.shift(5))/FISA.Price.shift(5)
GPNA['Total'] = (GPNA.Price.shift(0)-GPNA.Price.shift(5))/GPNA.Price.shift(5)
JUNA['Total'] = (JUNA.Price.shift(0)-JUNA.Price.shift(5))/JUNA.Price.shift(5)
```

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
"""Entry point for launching an IPython kernel.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
This is separate from the ipykernel package so we can avoid doin
g imports until
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
after removing the cwd from sys.path.
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: Se
ttingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
"""
```


In [47]:

```
# TODO: Change the format of date
ADIA['Date'] = pd.to_datetime(ADIA['Date-Time'])
FIDa['Date'] = pd.to_datetime(FIDa['Date-Time'])
FISa['Date'] = pd.to_datetime(FISa['Date-Time'])
GPNa['Date'] = pd.to_datetime(GPNa['Date-Time'])
JUNa['Date'] = pd.to_datetime(JUNa['Date-Time'])
```

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""Entry point for launching an IPython kernel.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

This is separate from the ipykernel package so we can avoid doing imports until

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

after removing the cwd from sys.path.

/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

"""

In [48]:

```
# TODO: Change the format of date
ADIA['Date1'] = ADIA['Date'].dt.date
FIDa['Date1'] = FIDa['Date'].dt.date
FISa['Date1'] = FISa['Date'].dt.date
GPNa['Date1'] = GPNa['Date'].dt.date
JUNa['Date1'] = JUNa['Date'].dt.date
```

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:1: SettingWithCopyWarning:
```

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
"""Entry point for launching an IPython kernel.
```

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:
```

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:3: SettingWithCopyWarning:
```

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

This is separate from the ipykernel package so we can avoid doing imports until

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:4: SettingWithCopyWarning:
```

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
after removing the cwd from sys.path.
```

```
/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:5: SettingWithCopyWarning:
```

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation: <http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy>

```
"""
```

In [49]:

```
# TODO: Compute the means of ALL impacts for different groups
PermanentsTotalADI = ADIa.groupby('Date1', as_index=False)['Permanent'].mean()
TemporaryTotalADI = ADIa.groupby('Date1', as_index=False)['Temporary'].mean()
TotalTotalADI = ADIa.groupby('Date1', as_index=False)['Total'].mean()
PermanentsTotalFID = FIDa.groupby('Date1', as_index=False)['Permanent'].mean()
TemporaryTotalFID = FIDa.groupby('Date1', as_index=False)['Temporary'].mean()
TotalTotalFID = FIDa.groupby('Date1', as_index=False)['Total'].mean()
PermanentsTotalFIS = FISa.groupby('Date1', as_index=False)['Permanent'].mean()
TemporaryTotalFIS = FISa.groupby('Date1', as_index=False)['Temporary'].mean()
TotalTotalFIS = FISa.groupby('Date1', as_index=False)['Total'].mean()
PermanentsTotalGPN = GPNa.groupby('Date1', as_index=False)['Permanent'].mean()
TemporaryTotalGPN = GPNa.groupby('Date1', as_index=False)['Temporary'].mean()
TotalTotalGPN = GPNa.groupby('Date1', as_index=False)['Total'].mean()
PermanentsTotalJUN = JUNA.groupby('Date1', as_index=False)['Permanent'].mean()
TemporaryTotalJUN = JUNA.groupby('Date1', as_index=False)['Temporary'].mean()
TotalTotalJUN = JUNA.groupby('Date1', as_index=False)['Total'].mean()
```

In [50]:

```
# TODO: Merge datasets
ADIFINAL = PermanentsTotalADI.merge(TemporaryTotalADI,on='Date1').merge(TotalTotalADI,on='Date1')
FIDFINAL = PermanentsTotalFID.merge(TemporaryTotalFID,on='Date1').merge(TotalTotalFID,on='Date1')
FISFINAL = PermanentsTotalFIS.merge(TemporaryTotalFIS,on='Date1').merge(TotalTotalFIS,on='Date1')
GPNFINAL = PermanentsTotalGPN.merge(TemporaryTotalGPN,on='Date1').merge(TotalTotalGPN,on='Date1')
JUNFINAL = PermanentsTotalJUN.merge(TemporaryTotalJUN,on='Date1').merge(TotalTotalJUN,on='Date1')
```

In [51]:

```
# TODO: Compute the means of TWIT impacts for different groups
PermanenttwitADI = ADId.groupby('Date1', as_index=False)['PERMANENTIMPACT'].mean()
TemporarytwitADI = ADId.groupby('Date1', as_index=False)['TEMPORARYIMPACT'].mean()
TotaltwitADI = ADId.groupby('Date1', as_index=False)['TOTALIMPACT'].mean()
PermanenttwitFID = FIDd.groupby('Date1', as_index=False)['PERMANENTIMPACT'].mean()
TemporarytwitFID = FIDd.groupby('Date1', as_index=False)['TEMPORARYIMPACT'].mean()
TotaltwitFID = FIDd.groupby('Date1', as_index=False)['TOTALIMPACT'].mean()
PermanenttwitFIS = FISd.groupby('Date1', as_index=False)['PERMANENTIMPACT'].mean()
TemporarytwitFIS = FISd.groupby('Date1', as_index=False)['TEMPORARYIMPACT'].mean()
TotaltwitFIS = FISd.groupby('Date1', as_index=False)['TOTALIMPACT'].mean()
PermanenttwitGPN = GPNd.groupby('Date1', as_index=False)['PERMANENTIMPACT'].mean()
TemporarytwitGPN = GPNd.groupby('Date1', as_index=False)['TEMPORARYIMPACT'].mean()
TotaltwitGPN = GPNd.groupby('Date1', as_index=False)['TOTALIMPACT'].mean()
PermanenttwitJUN = JUNd.groupby('Date1', as_index=False)['PERMANENTIMPACT'].mean()
TemporarytwitJUN = JUNd.groupby('Date1', as_index=False)['TEMPORARYIMPACT'].mean()
TotaltwitJUN = JUNd.groupby('Date1', as_index=False)['TOTALIMPACT'].mean()
```

In [52]:

```
# TODO: Merge datasets
ADIFINALTWIT = PermanenttwitADI.merge(TemporarytwitADI,on='Date1').merge(TotaltwitADI,on='Date1')
FIDFINALTWIT = PermanenttwitFID.merge(TemporarytwitFID,on='Date1').merge(TotaltwitFID,on='Date1')
FISFINALTWIT = PermanenttwitFIS.merge(TemporarytwitFIS,on='Date1').merge(TotaltwitFIS,on='Date1')
GPNFINALTWIT = PermanenttwitGPN.merge(TemporarytwitGPN,on='Date1').merge(TotaltwitGPN,on='Date1')
JUNFINALTWIT = PermanenttwitJUN.merge(TemporarytwitJUN,on='Date1').merge(TotaltwitJUN,on='Date1')
```

In [53]:

```
# TODO: Merge datasets.
ADILAST = pd.merge(ADIFINAL, ADIFINALTWIT, on='Date1', how='outer')
FIDLAST = pd.merge(FIDFINAL, FIDFINALTWIT, on='Date1', how='outer')
FISLAST = pd.merge(FISFINAL, FISFINALTWIT, on='Date1', how='outer')
GPNLAST = pd.merge(GPNFINAL, GPNFINALTWIT, on='Date1', how='outer')
JUNLAST = pd.merge(JUNFINAL, JUNFINALTWIT, on='Date1', how='outer')
```

In [54]:

```
# TODO: Delete missing.
import numpy as np
ADILASTONLYTWIT = ADILAST[np.isfinite(ADILAST['PERMANENTIMPACT'])]
FIDLASTONLYTWIT = FIDLAST[np.isfinite(FIDLAST['PERMANENTIMPACT'])]
FISLASTONLYTWIT = FISLAST[np.isfinite(FISLAST['PERMANENTIMPACT'])]
GPNLASTONLYTWIT = GPNLAST[np.isfinite(GPNLAST['PERMANENTIMPACT'])]
JUNLASTONLYTWIT = JUNLAST[np.isfinite(JUNLAST['PERMANENTIMPACT'])]
```

In [56]:

```
# TODO: Ascengind order. For descengind write False
ADILASTONLYTWIT = ADILASTONLYTWIT.sort_values('Date1', ascending=True)
FIDLASTONLYTWIT = FIDLASTONLYTWIT.sort_values('Date1', ascending=True)
FISLASTONLYTWIT = FISLASTONLYTWIT.sort_values('Date1', ascending=True)
GPNLASTONLYTWIT = GPNLASTONLYTWIT.sort_values('Date1', ascending=True)
JUNLASTONLYTWIT = JUNLASTONLYTWIT.sort_values('Date1', ascending=True)
```

In [57]:

```
# TODO: Combine data
TotalTASK2 = pd.concat([ADILASTONLYTWIT, FIDLASTONLYTWIT, FISLASTONLYTWIT, GPNLAS
ONLYTWIT, JUNLASTONLYTWIT])
```

In [58]:

```
# TODO: MannWHitney test
from scipy.stats import mannwhitneyu
mannwhitneyu(TotalTASK2['Permanent'], TotalTASK2['PERMANENTIMPACT'])
```

Out[58]:

```
MannwhitneyuResult(statistic=628.0, pvalue=0.27245334121979464)
```

In [59]:

```
# TODO: MannWHitney test
mannwhitneyu(TotalTASK2['Temporary'], TotalTASK2['TEMPORARYIMPACT'])
```

Out[59]:

```
MannwhitneyuResult(statistic=621.0, pvalue=0.24782070093053654)
```

In [60]:

```
# TODO: MannWHitney test
mannwhitneyu(TotalTASK2['Total'], TotalTASK2['TOTALIMPACT'])
```

Out[60]:

```
MannwhitneyuResult(statistic=614.0, pvalue=0.22459780224426357)
```

In [61]:

```
# TODO: t test
from scipy.stats import ttest_ind
ttest_ind(TotalTASK2['Permanent'], TotalTASK2['PERMANENTIMPACT'])
```

Out[61]:

```
Ttest_indResult(statistic=-1.3079250205315665, pvalue=0.1950593344
378579)
```

In [62]:

```
# TODO: t test
ttest_ind(TotalTASK2['Temporary'], TotalTASK2['TEMPORARYIMPACT'])
```

Out[62]:

```
Ttest_indResult(statistic=0.18195213278982417, pvalue=0.8561315909
05189)
```

In [63]:

```
# TODO: t test
ttest_ind(TotalTASK2['Total'], TotalTASK2['TOTALIMPACT'])
```

Out[63]:

```
Ttest_indResult(statistic=-1.6168690355178088, pvalue=0.1102799128
0796927)
```

In [64]:

```
# TODO: compute mean
TotalTASK2["Permanent"].mean()
```

Out[64]:

```
6.984331014513794e-06
```

In [65]:

```
# TODO: compute mean
TotalTASK2["PERMANENTIMPACT"].mean()
```

Out[65]:

```
0.003408985819700504
```

In [66]:

```
# TODO: compute mean
TotalTASK2["Temporary"].mean()
```

Out[66]:

```
3.3659876419179393e-06
```

In [67]:

```
# TODO: compute mean
TotalTASK2["TEMPORARYIMPACT"].mean()
```

Out[67]:

-0.0002608952962271218

In [68]:

```
# TODO: compute mean
TotalTASK2["Total"].mean()
```

Out[68]:

3.744807584777608e-06

In [69]:

```
# TODO: compute mean
TotalTASK2["TOTALIMPACT"].mean()
```

Out[69]:

0.0036813248541050637

In [71]:

```
# TODO: Winsorized
from scipy.stats import mstats
def WinsorizeStats(TotalTASK2):
    out = mstats.winsorize(TotalTASK2, limits=[0.05, 0.05])
    return out
```

In [72]:

```
# TODO: Winsorized
TotalTASK3 = TotalTASK2[['Permanent', 'Temporary', 'Total', 'PERMANENTIMPACT', 'TEMPORARYIMPACT', 'TOTALIMPACT']].apply(WinsorizeStats, axis=0)
```

In [74]:

```
TotalTASK3["Permanent"].mean()
```

Out[74]:

9.09783793800208e-06

In [75]:

```
TotalTASK3["PERMANENTIMPACT"].mean()
```

Out[75]:

0.0035348658810689915

In [76]:

```
TotalTASK3["Temporary"].mean()
```

Out[76]:

```
4.911806964476276e-06
```

In [77]:

```
TotalTASK3["TEMPORARYIMPACT"].mean()
```

Out[77]:

```
0.0008417016685047863
```

In [78]:

```
TotalTASK3["Total"].mean()
```

Out[78]:

```
4.277009079935957e-06
```

In [79]:

```
TotalTASK3["TOTALIMPACT"].mean()
```

Out[79]:

```
0.003468839229112132
```

In [86]:

```
from scipy.stats import mannwhitneyu  
mannwhitneyu>TotalTASK3['Permanent'], TotalTASK3['PERMANENTIMPACT'])
```

Out[86]:

```
MannwhitneyuResult(statistic=629.0, pvalue=0.27604694336955304)
```

In [87]:

```
mannwhitneyu>TotalTASK3['Temporary'], TotalTASK3['TEMPORARYIMPACT'])
```

Out[87]:

```
MannwhitneyuResult(statistic=623.0, pvalue=0.254706290201428)
```

In [88]:

```
mannwhitneyu>TotalTASK3['Total'], TotalTASK3['TOTALIMPACT'])
```

Out[88]:

```
MannwhitneyuResult(statistic=614.0, pvalue=0.2245910865435336)
```


In [89]:

```
from scipy.stats import ttest_ind  
ttest_ind(TotalTASK3['Permanent'], TotalTASK3['PERMANENTIMPACT'])
```

Out[89]:

```
Ttest_indResult(statistic=-1.5004925149693091, pvalue=0.1378595261  
386832)
```

In [90]:

```
ttest_ind(TotalTASK3['Temporary'], TotalTASK3['TEMPORARYIMPACT'])
```

Out[90]:

```
Ttest_indResult(statistic=-1.2592965857794014, pvalue=0.2119904760  
5142543)
```

In [91]:

```
ttest_ind(TotalTASK3['Total'], TotalTASK3['TOTALIMPACT'])
```

Out[91]:

```
Ttest_indResult(statistic=-1.6308970859952479, pvalue=0.1072790595  
7117642)
```