

```
In [1]: import pandas as pd
import numpy as np
import pandas as pd
from matplotlib import pyplot as plt
import seaborn as sns
from sklearn.preprocessing import StandardScaler
from sklearn import preprocessing
%matplotlib inline
```

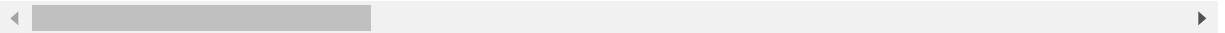
```
In [2]: df = pd.read_csv('../high_diamond_ranked_10min.csv')
```

```
In [3]: df.head()
```

Out[3]:

	gameId	blueWins	blueWardsPlaced	blueWardsDestroyed	blueFirstBlood	blueKills	blueC
0	4519157822	0	28	2	1	9	
1	4523371949	0	12	1	0	5	
2	4521474530	0	15	0	0	7	
3	4524384067	0	43	1	0	4	
4	4436033771	0	75	4	0	6	

5 rows × 40 columns



```
In [4]: df.isnull().sum()
```

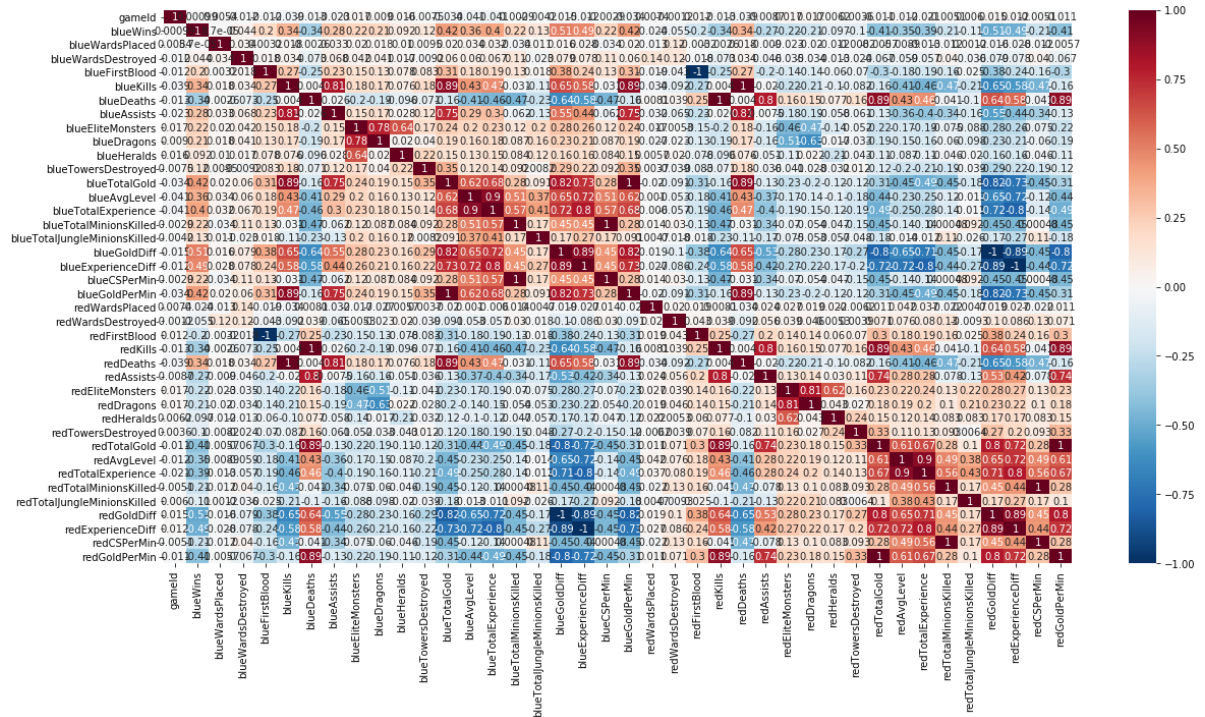
```
Out[4]: gameId                                0
blueWins                                    0
blueWardsPlaced                            0
blueWardsDestroyed                         0
blueFirstBlood                            0
blueKills                                  0
blueDeaths                                 0
blueAssists                               0
blueEliteMonsters                         0
blueDragons                               0
blueHeralds                               0
blueTowersDestroyed                       0
blueTotalGold                             0
blueAvgLevel                              0
blueTotalExperience                       0
blueTotalMinionsKilled                   0
blueTotalJungleMinionsKilled             0
blueGoldDiff                              0
blueExperienceDiff                       0
blueCSPerMin                             0
blueGoldPerMin                           0
redWardsPlaced                            0
redWardsDestroyed                         0
redFirstBlood                            0
redKills                                  0
redDeaths                                 0
redAssists                               0
redEliteMonsters                         0
redDragons                               0
redHeralds                               0
redTowersDestroyed                       0
redTotalGold                             0
redAvgLevel                              0
redTotalExperience                       0
redTotalMinionsKilled                   0
redTotalJungleMinionsKilled             0
redGoldDiff                              0
redExperienceDiff                       0
redCSPerMin                             0
redGoldPerMin                           0
dtype: int64
```

```
In [5]: df.dtypes
```

```
Out[5]: gameId                int64
blueWins                    int64
blueWardsPlaced             int64
blueWardsDestroyed          int64
blueFirstBlood              int64
blueKills                   int64
blueDeaths                  int64
blueAssists                 int64
blueEliteMonsters           int64
blueDragons                 int64
blueHeralds                 int64
blueTowersDestroyed         int64
blueTotalGold               int64
blueAvgLevel                float64
blueTotalExperience          int64
blueTotalMinionsKilled      int64
blueTotalJungleMinionsKilled int64
blueGoldDiff                int64
blueExperienceDiff          int64
blueCSPerMin                float64
blueGoldPerMin              float64
redWardsPlaced              int64
redWardsDestroyed           int64
redFirstBlood               int64
redKills                    int64
redDeaths                   int64
redAssists                  int64
redEliteMonsters            int64
redDragons                  int64
redHeralds                  int64
redTowersDestroyed          int64
redTotalGold                int64
redAvgLevel                 float64
redTotalExperience           int64
redTotalMinionsKilled       int64
redTotalJungleMinionsKilled int64
redGoldDiff                 int64
redExperienceDiff            int64
redCSPerMin                 float64
redGoldPerMin               float64
dtype: object
```

```
In [6]: # Finding the relations between the variables.
plt.figure(figsize=(20,10))
sns.heatmap(df.corr(), cmap='RdBu_r', annot=True)
```

Out[6]: <matplotlib.axes._subplots.AxesSubplot at 0x2bc08ee9ba8>



Some variable pairs are perfectly correlated so they are interchangeable:

1. redFirstBlood and blueFirstBlood
2. redDeaths and blueKills
3. redKills and blueDeaths
4. blueGoldPerMin and blueTotalGold
5. blueCSPerMin and blueTotalMinionsKilled
6. redGoldDiff and blueGoldDiff
7. redExperienceDiff and blueExperienceDiff
8. redGoldPerMin and redTotalGold
9. redCSPerMin and redTotalMinionsKilled

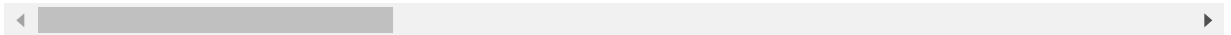
Dropping irrelevant columns

```
In [7]: # gameId are irrelevant obviously. blueAvgLevel and redAvgLevel are not significant?
#TotalJungleMinionsKilled and TotalMinionsKilled are repeated
df = df.drop(columns=['gameId', 'redFirstBlood', 'redDeaths', 'redKills', 'blueGoldPerMin', 'blueCSPerMin',
                    'redGoldDiff', 'redExperienceDiff', 'redGoldPerMin', 'redCSPerMin',
                    'blueTotalJungleMinionsKilled', 'redTotalJungleMinionsKilled'])
df.head()
```

Out[7]:

	blueWins	blueWardsPlaced	blueWardsDestroyed	blueFirstBlood	blueKills	blueDeaths	blueAssists
0	0	28	2	1	9	6	11
1	0	12	1	0	5	5	11
2	0	15	0	0	7	11	11
3	0	43	1	0	4	5	11
4	0	75	4	0	6	6	11

5 rows × 28 columns



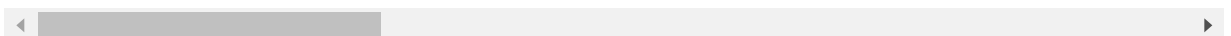
standardize

```
In [8]: scaler = StandardScaler()
features = df.drop(columns=['blueWins']).values
x=scaler.fit_transform(features)
std_df= pd.DataFrame(data = x, columns = df.drop(columns=['blueWins']).columns)
std_df.head()
```

Out[8]:

	blueWardsPlaced	blueWardsDestroyed	blueFirstBlood	blueKills	blueDeaths	blueAssists	blueGoldPerMin
0	0.316996	-0.379275	0.990429	0.935301	-0.046926	1.071495	11.0
1	-0.570992	-0.839069	-1.009663	-0.393216	-0.387796	-0.404768	11.0
2	-0.404494	-1.298863	-1.009663	0.271042	1.657424	-0.650812	11.0
3	1.149484	-0.839069	-1.009663	-0.725346	-0.387796	-0.404768	11.0
4	2.925460	0.540312	-1.009663	-0.061087	-0.046926	-0.158724	11.0

5 rows × 27 columns



Normalize

```
In [9]: X = preprocessing.normalize(features)
norm_df = pd.DataFrame(data = X, columns = df.drop(columns=['blueWins']).columns)
norm_df.head()
```

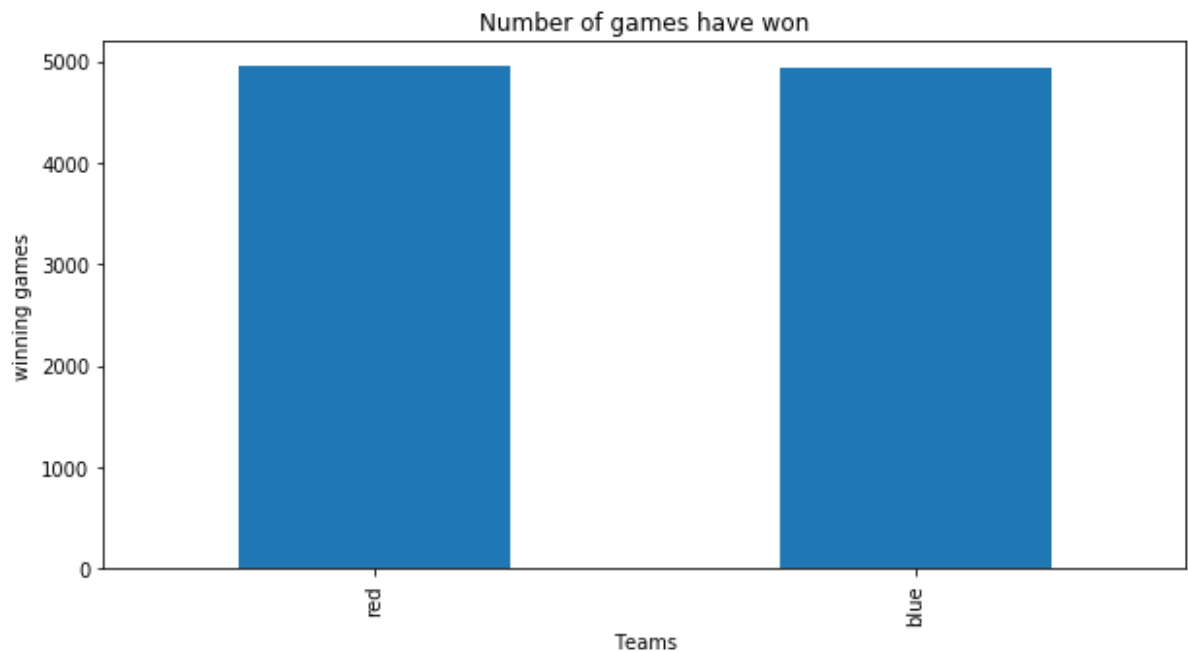
Out[9]:

	blueWardsPlaced	blueWardsDestroyed	blueFirstBlood	blueKills	blueDeaths	blueAssists	blueWins
0	0.000825	0.000059	0.000029	0.000265	0.000177	0.000324	0.000177
1	0.000361	0.000030	0.000000	0.000150	0.000150	0.000150	0.000150
2	0.000448	0.000000	0.000000	0.000209	0.000328	0.000119	0.000119
3	0.001269	0.000030	0.000000	0.000118	0.000148	0.000148	0.000148
4	0.002119	0.000113	0.000000	0.000170	0.000170	0.000170	0.000170

5 rows × 27 columns

```
In [10]: df.blueWins.value_counts().plot(kind='bar', figsize=(10,5))
plt.title('Number of games have won')
plt.ylabel('winning games')
plt.xticks([0,1],['red','blue'])
plt.xlabel('Teams')
```

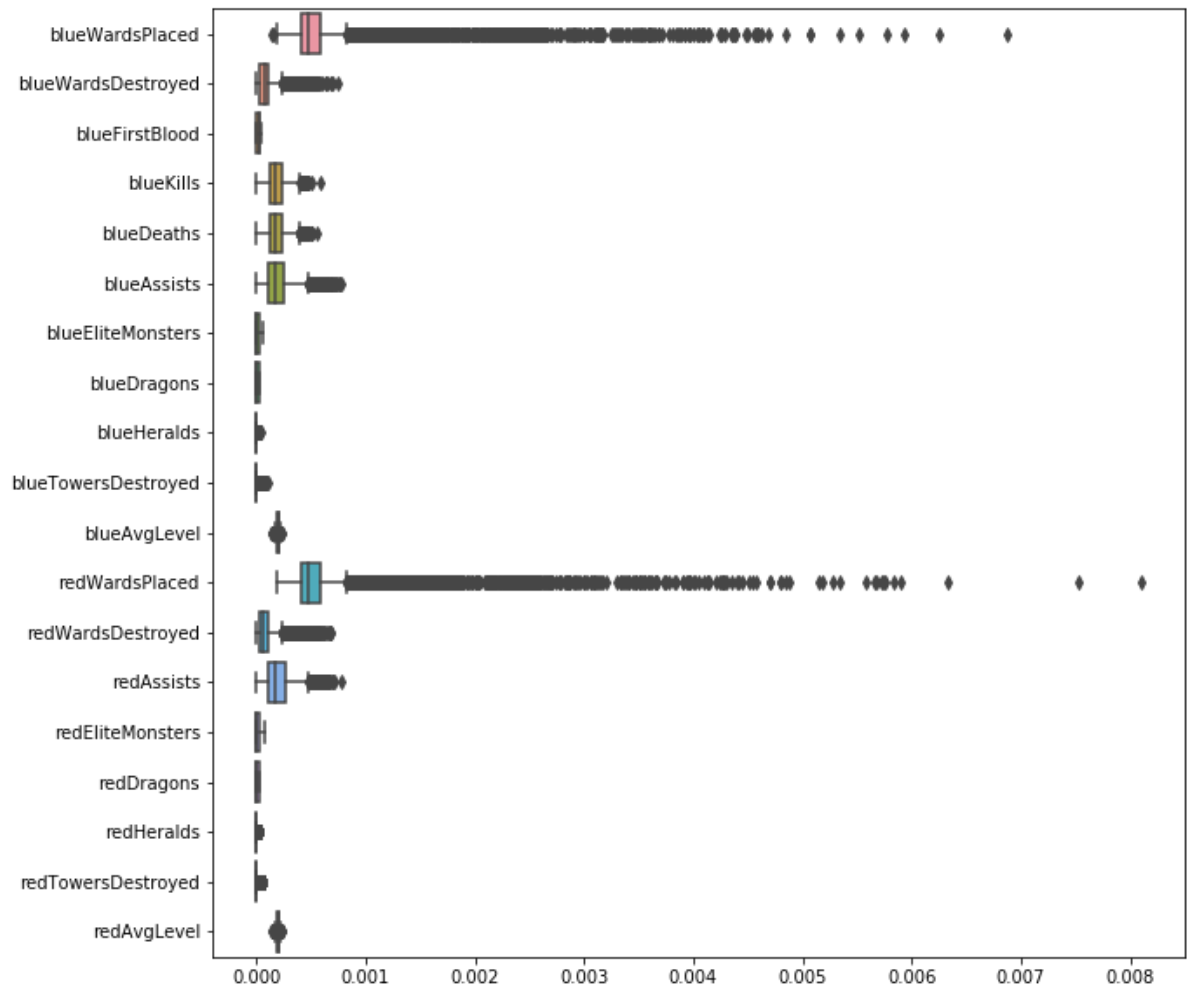
Out[10]: Text(0.5, 0, 'Teams')

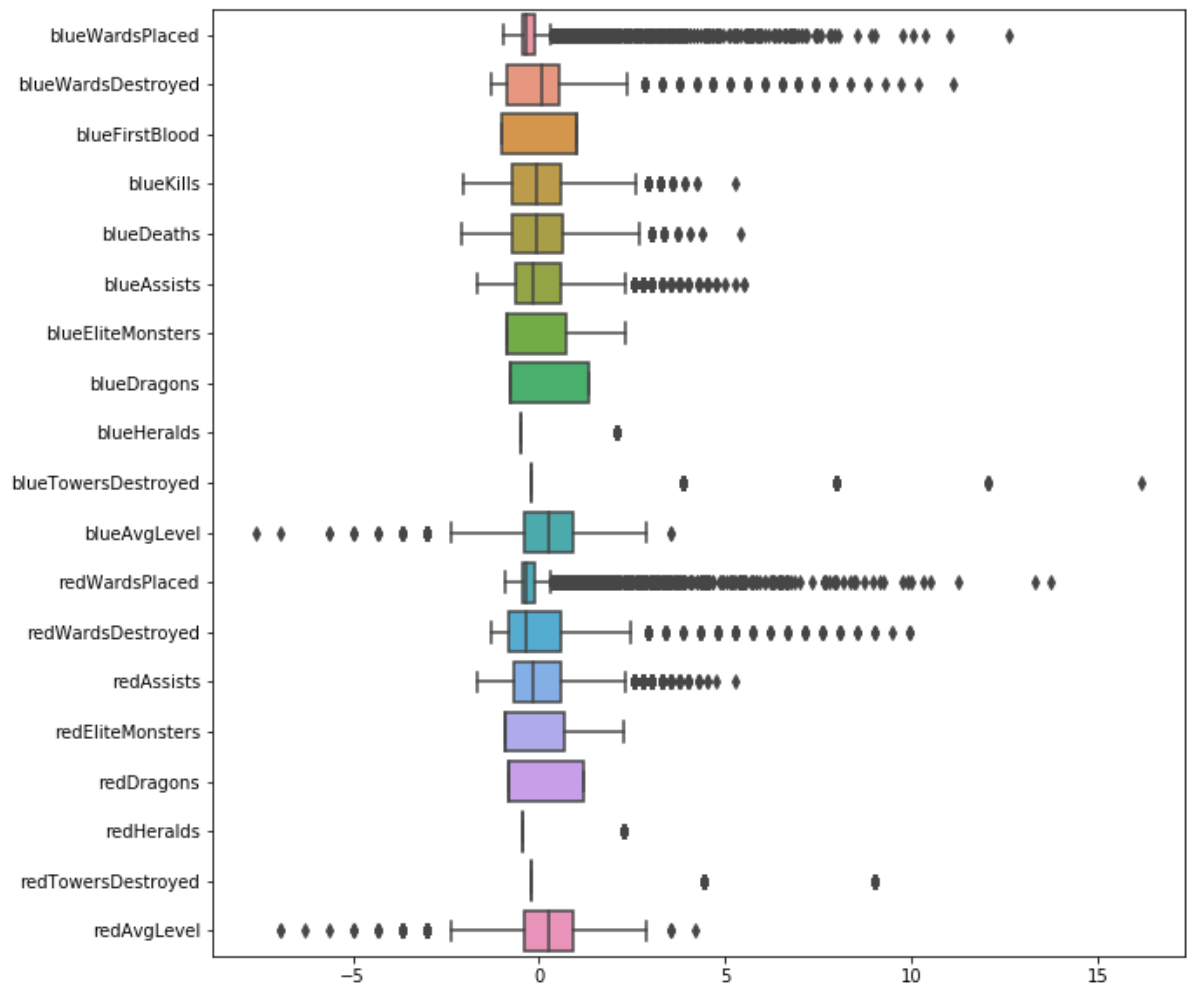


Detecting Outliers

```
In [11]: fig,ax= plt.subplots(figsize=(10,10))
sns.boxplot(data=norm_df.drop(columns=['blueTotalGold','blueTotalExperience',
'redTotalGold',
'redTotalExperience','blueGoldDiff', 'blueExperienceDiff',
'blueTotalMinionsKilled','redTotalMinionsKilled'],),orient='h')
fig2,ax2= plt.subplots(figsize=(10,10))
sns.boxplot(data=std_df.drop(columns=['blueTotalGold','blueTotalExperience','redTotalGold',
'redTotalExperience','blueGoldDiff', 'blueExperienceDiff',
'blueTotalMinionsKilled','redTotalMinionsKilled'],),orient='h')
```

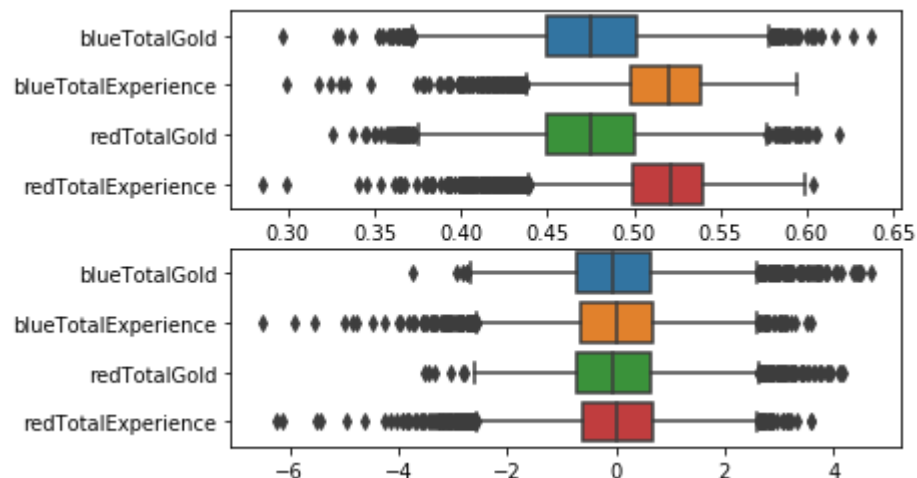
Out[11]: <matplotlib.axes._subplots.AxesSubplot at 0x2bc09949f60>





```
In [12]: plt.subplot(2,1,1)
sns.boxplot(data=norm_df.loc[:,['blueTotalGold','blueTotalExperience','redTotalGold','redTotalExperience']],orient='h')
plt.subplot(2,1,2)
sns.boxplot(data=std_df.loc[:,['blueTotalGold','blueTotalExperience','redTotalGold','redTotalExperience']],orient='h')
```

Out[12]: <matplotlib.axes._subplots.AxesSubplot at 0x2bc0b509ba8>



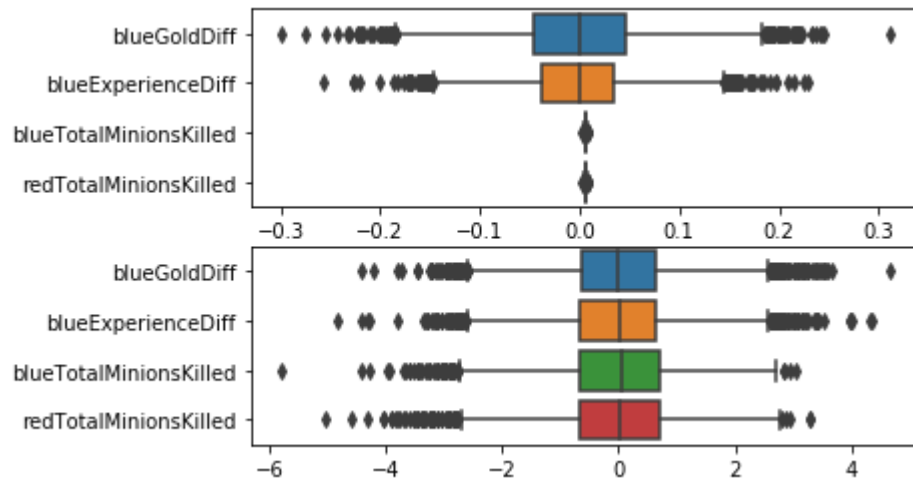
```

In [13]: plt.subplot(2,1,1)
sns.boxplot(data=norm_df.loc[:,['blueGoldDiff','blueExperienceDiff','blueTotalMinionsKilled',
                                'redTotalMinionsKilled']],orient='h')

plt.subplot(2,1,2)
sns.boxplot(data=std_df.loc[:,['blueGoldDiff','blueExperienceDiff','blueTotalMinionsKilled',
                                'redTotalMinionsKilled']],orient='h')

```

Out[13]: <matplotlib.axes._subplots.AxesSubplot at 0x2bc0b390630>



In []: