

Data Exploration

In [264]:

```
1 import numpy as np
```

In [265]:

```
1 import pandas as pd
```

In [266]:

```
1 df = pd.read_csv("https://raw.githubusercontent.com/anshupandey/Machine_Learning_Training/master/pressureMoistureTemperature.csv")
2 df.shape
```

Out[266]:

(1000, 7)

In [267]:

```
1 df.head()
```

Out[267]:

	lifetime	broken	pressureInd	moistureInd	temperatureInd	team	provider
0	56	0	92.178854	104.230204	96.517159	TeamA	Provider4
1	81	1	72.075938	183.065701	87.271062	TeamC	Provider4
2	60	0	96.272254	77.801376	112.196170	TeamA	Provider1
3	86	1	94.406461	178.493608	72.025374	TeamC	Provider2
4	34	0	97.752899	99.413492	103.756271	TeamB	Provider1

In [268]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1000 entries, 0 to 999
Data columns (total 7 columns):
lifetime          1000 non-null int64
broken            1000 non-null int64
pressureInd       996 non-null float64
moistureInd       1000 non-null float64
temperatureInd    997 non-null float64
team              1000 non-null object
provider          1000 non-null object
dtypes: float64(3), int64(2), object(2)
memory usage: 54.8+ KB
```

In [269]:

```
1 df.describe()
2
```

Out[269]:

	lifetime	broken	pressureInd	moistureInd	temperatureInd
count	1000.000000	1000.000000	996.000000	1000.000000	997.000000
mean	55.195000	0.397000	98.681100	111.088723	100.553499
std	26.472737	0.489521	19.879703	41.839005	19.592059
min	1.000000	0.000000	33.481917	70.928815	42.279598
25%	34.000000	0.000000	85.562282	94.532547	87.672094
50%	60.000000	0.000000	97.311091	102.844084	100.528015
75%	80.000000	1.000000	112.253190	113.532970	113.522496
max	93.000000	1.000000	173.282541	1156.493254	172.544140

DATA CLEANING

In [270]:

```
1 df.duplicated().sum()
```

Out[270]:

0

In [271]:

```
1 df.isnull().sum()
```

Out[271]:

lifetime 0
broken 0
pressureInd 4
moistureInd 0
temperatureInd 3
team 0
provider 0
dtype: int64

In [272]:

```
1 df.dropna(thresh=3,inplace=True)
```

In [273]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1000 entries, 0 to 999
Data columns (total 7 columns):
lifetime           1000 non-null int64
broken             1000 non-null int64
pressureInd        996 non-null float64
moistureInd         1000 non-null float64
temperatureInd     997 non-null float64
team               1000 non-null object
provider           1000 non-null object
dtypes: float64(3), int64(2), object(2)
memory usage: 62.5+ KB
```

In [274]:

```
1 df.team.unique()
```

Out[274]:

```
array(['TeamA', 'TeamC', 'TeamB'], dtype=object)
```

In [275]:

```
1 df.provider.unique()
```

Out[275]:

```
array(['Provider4', 'Provider1', 'Provider2', 'Provider3'], dtype=object)
```

In [276]:

```
1 df.isnull().sum()
```

Out[276]:

```
lifetime      0
broken         0
pressureInd     4
moistureInd     0
temperatureInd  3
team           0
provider       0
dtype: int64
```

In [277]:

```
1 df.skew()
```

Out[277]:

```
lifetime      -0.407597
broken         0.421663
pressureInd     0.117541
moistureInd    15.982324
temperatureInd -0.070839
dtype: float64
```

In [278]:

```
1 median = df['temperatureInd'].median()  
2 median
```

Out[278]:

100.52801459999999

In [279]:

```
1 df['temperatureInd'].fillna(median, inplace=True)
```

In [280]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
Int64Index: 1000 entries, 0 to 999  
Data columns (total 7 columns):  
lifetime          1000 non-null int64  
broken            1000 non-null int64  
pressureInd       996 non-null float64  
moistureInd       1000 non-null float64  
temperatureInd    1000 non-null float64  
team              1000 non-null object  
provider          1000 non-null object  
dtypes: float64(3), int64(2), object(2)  
memory usage: 62.5+ KB
```

In [281]:

```
1 mean = df['pressureInd'].mean()  
2 mean
```

Out[281]:

98.68109962325292

In [282]:

```
1 df['pressureInd'].fillna(mean, inplace=True)
```

In [283]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
Int64Index: 1000 entries, 0 to 999  
Data columns (total 7 columns):  
lifetime          1000 non-null int64  
broken            1000 non-null int64  
pressureInd       1000 non-null float64  
moistureInd       1000 non-null float64  
temperatureInd    1000 non-null float64  
team              1000 non-null object  
provider          1000 non-null object  
dtypes: float64(3), int64(2), object(2)  
memory usage: 62.5+ KB
```

In [284]:

```
1 df.isnull().sum()
```

Out[284]:

```
lifetime      0
broken        0
pressureInd    0
moistureInd    0
temperatureInd 0
team          0
provider       0
dtype: int64
```

In [285]:

```
1 df.skew()
```

Out[285]:

```
lifetime      -0.407597
broken         0.421663
pressureInd    0.117776
moistureInd    15.982324
temperatureInd -0.070933
dtype: float64
```

In [286]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1000 entries, 0 to 999
Data columns (total 7 columns):
lifetime      1000 non-null int64
broken        1000 non-null int64
pressureInd    1000 non-null float64
moistureInd    1000 non-null float64
temperatureInd 1000 non-null float64
team          1000 non-null object
provider       1000 non-null object
dtypes: float64(3), int64(2), object(2)
memory usage: 62.5+ KB
```

In []:

```
1
2
```

In [287]:

```
1 df[(df.moistureInd >250)]
```

Out[287]:

	lifetime	broken	pressureInd	moistureInd	temperatureInd	team	provider
604	80	1	96.105244	1156.493254	97.143188	TeamB	Provider1

In [288]:

```
1 mean1 = df['moistureInd'].mean()  
2 mean1
```

Out[288]:

111.08872284591999

In [289]:

```
1 df.loc[(df.moistureInd >250), 'moistureInd']=mean1
```

In [290]:

```
1 df[(df.moistureInd >250)]
```

Out[290]:

lifetime	broken	pressureInd	moistureInd	temperatureInd	team	provider
----------	--------	-------------	-------------	----------------	------	----------

In [291]:

```
1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
Int64Index: 1000 entries, 0 to 999  
Data columns (total 7 columns):  
lifetime          1000 non-null int64  
broken            1000 non-null int64  
pressureInd       1000 non-null float64  
moistureInd       1000 non-null float64  
temperatureInd    1000 non-null float64  
team              1000 non-null object  
provider          1000 non-null object  
dtypes: float64(3), int64(2), object(2)  
memory usage: 62.5+ KB
```

DATA ANALYTICS

In [292]:

```
1 df.columns
```

Out[292]:

```
Index(['lifetime', 'broken', 'pressureInd', 'moistureInd', 'temperatureInd',  
      'team', 'provider'],  
      dtype='object')
```

In [293]:

```
1 num = ['lifetime', 'pressureInd', 'moistureInd', 'temperatureInd']  
2 cats = ['broken', 'team', 'provider']
```

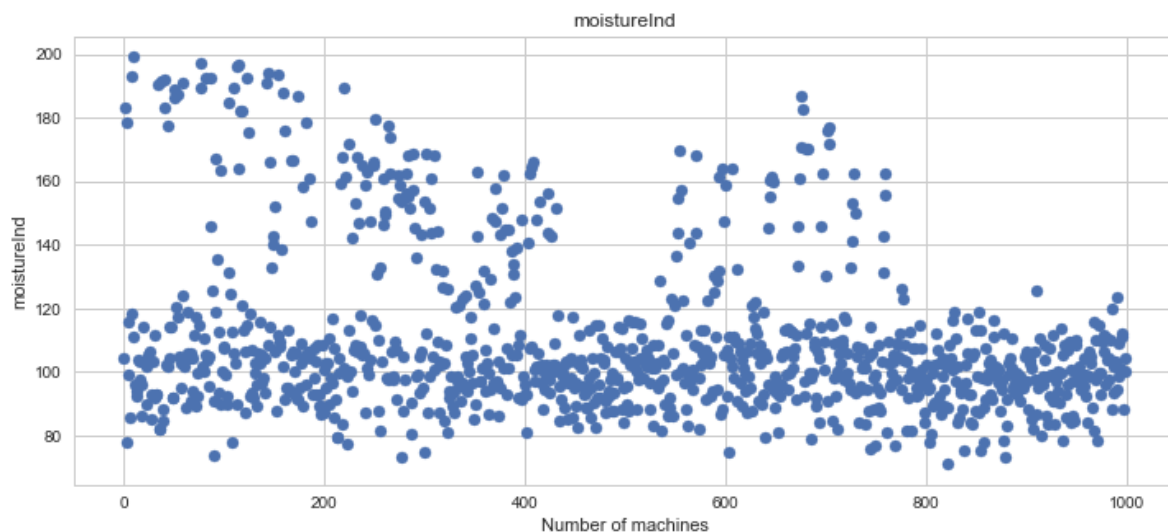
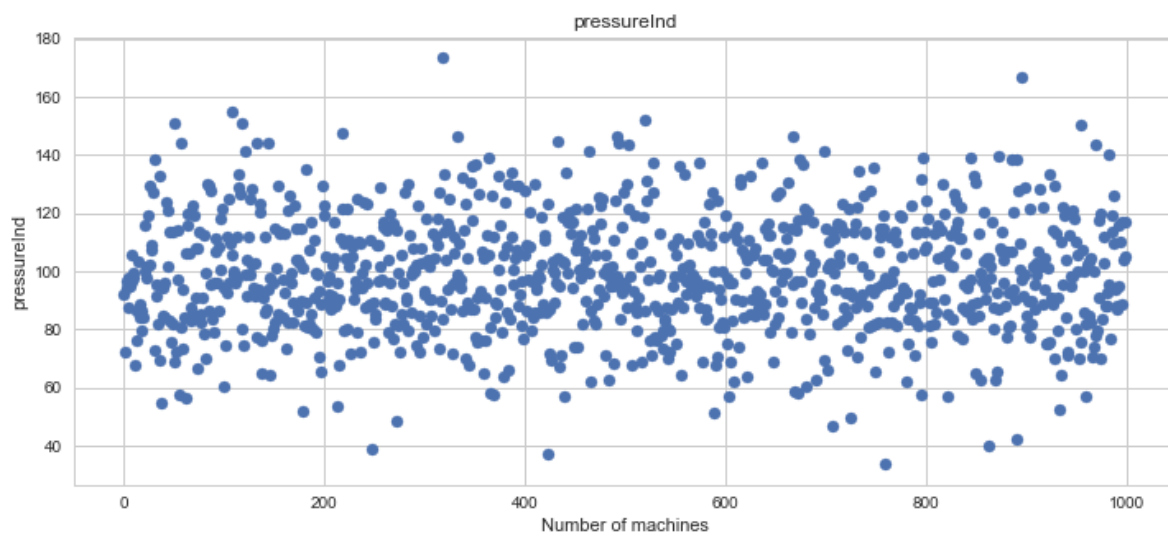
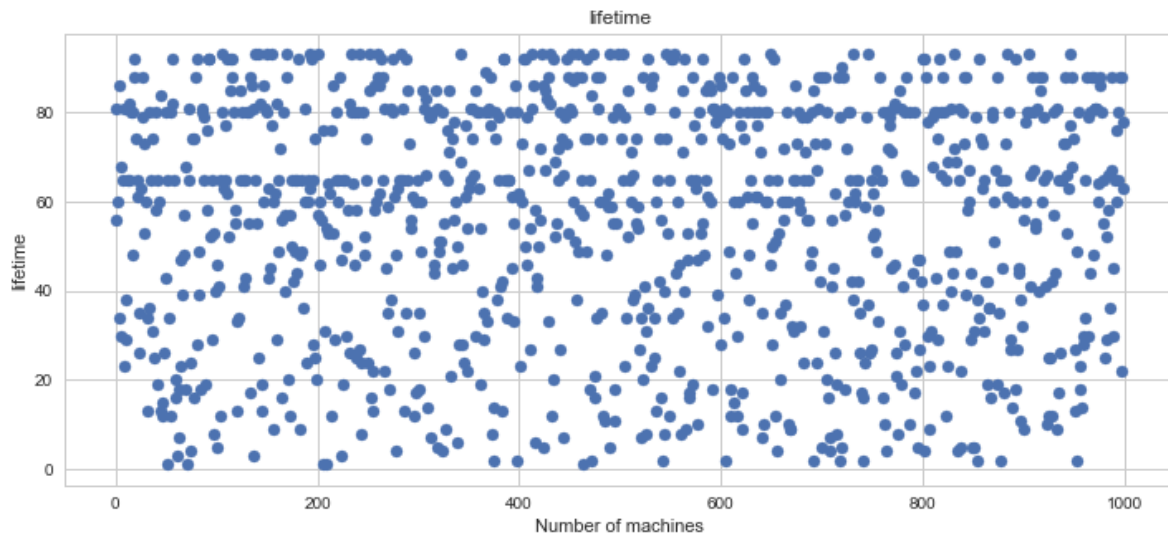
Univariate Analytics

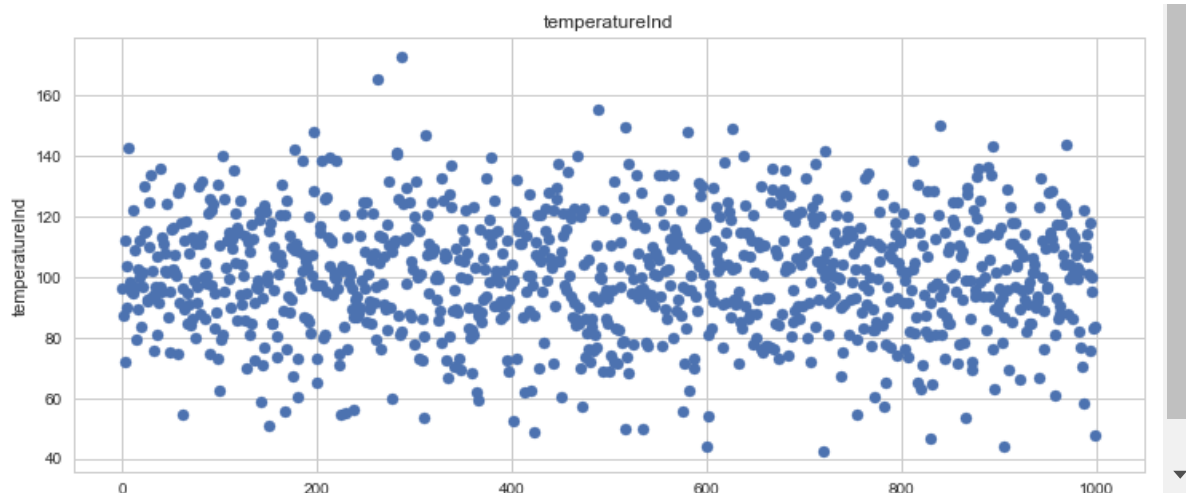
In [294]:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import seaborn as sns
```

In [295]:

```
1 for col in num:  
2     plt.figure(figsize=(12,5))  
3     plt.scatter(np.arange(1000),df[col])  
4     plt.xlabel("Number of machines")  
5     plt.ylabel(col)  
6     plt.title(col)  
7     plt.show()
```





#Note : ##From the univariant analysis, we can say that the lifetime of machines lies anywhere between 10-90 years and spread uniformly.

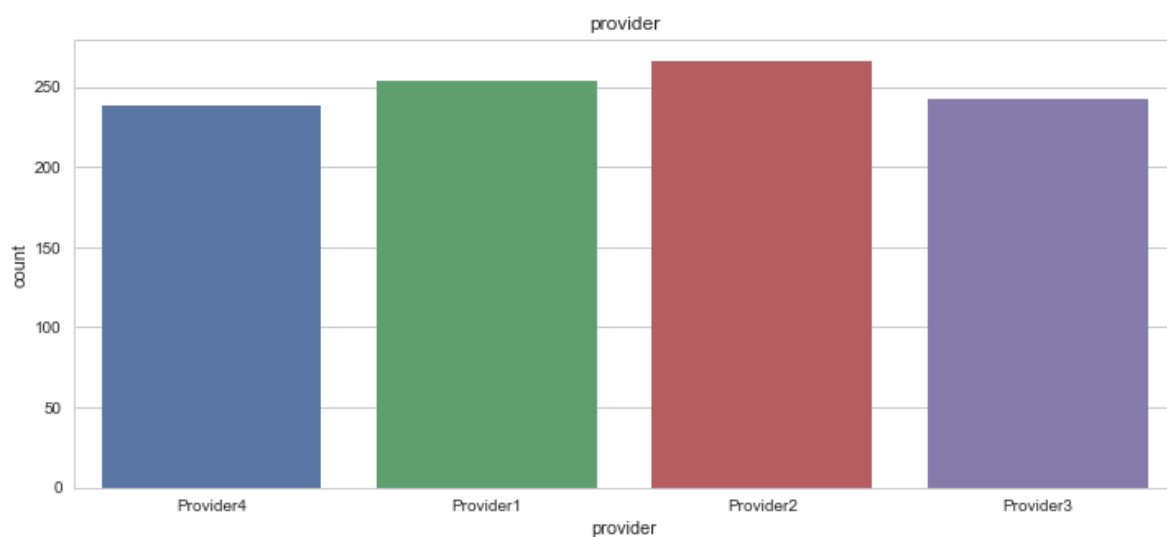
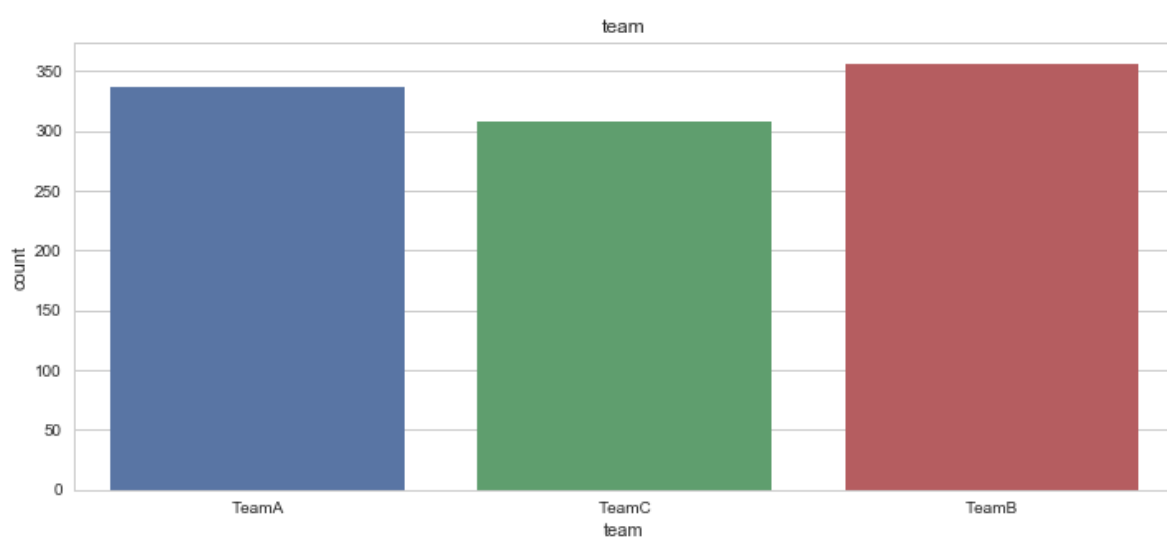
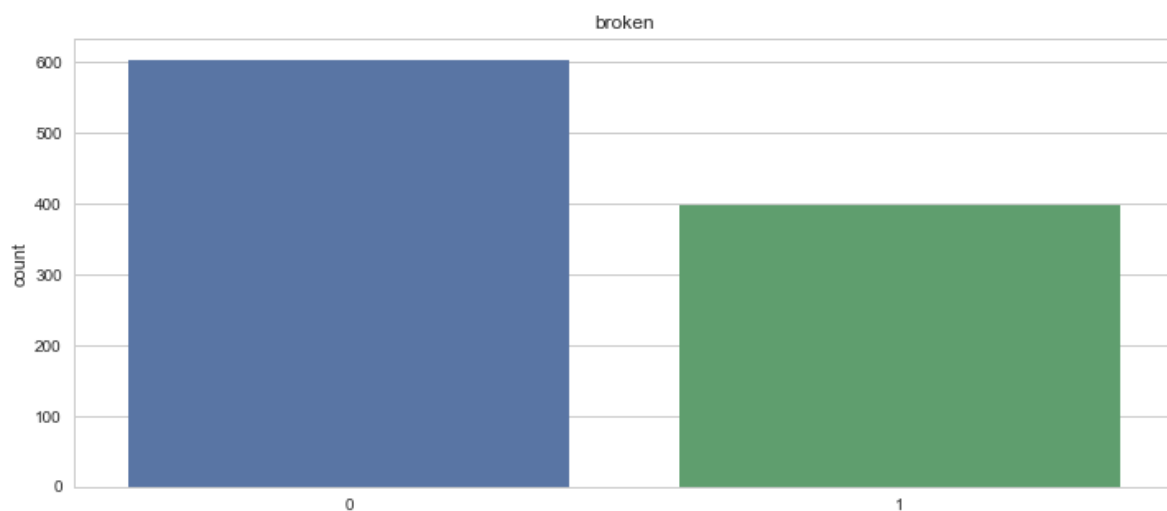
##Most of the pressure lies between 60 to 140.

##Excpet for one machine pressure is below 200.

Most of the temperature lies between 60-140.

In [296]:

```
1 for col in cats:  
2     plt.figure(figsize=(12,5))  
3     sns.countplot(df[col])  
4     #plt.xlabel("No of customers")  
5     #plt.ylabel(col)  
6     plt.title(col)  
7     plt.show()
```



In []:

1

In []:

1

Bi-varient Analysis

In [297]:

```
1 #lifetime vs getting damaged
2 #numerical vs categorical
3
4 plt.figure(figsize=(10,5))
5 sns.distplot(df.lifetime[df.broken==1])
6 sns.distplot(df.lifetime[df.broken==0])
7 plt.legend(['0','1'])
8 plt.show()
```

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462:
UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
warnings.warn("The 'normed' kwarg is deprecated, and has been ")
C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462:
UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.
warnings.warn("The 'normed' kwarg is deprecated, and has been ")



Note : Lifetime is an affecting factor as we can see machines with lifetime in range 60-100 are getting damaged

In [298]:

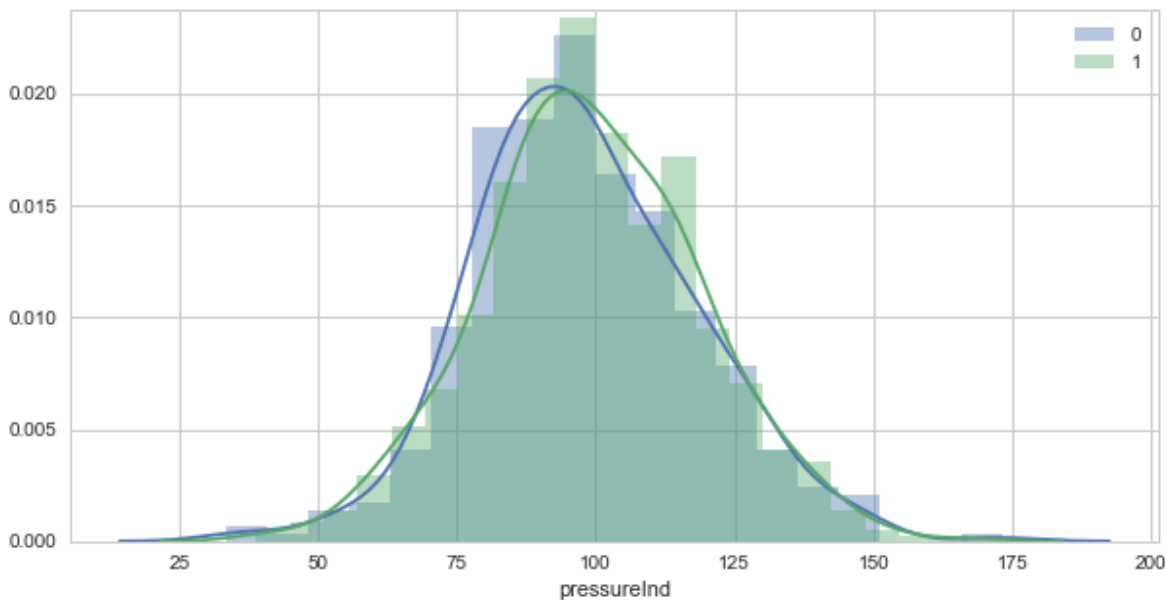
```
1
2 #numerical vs categorical
3
4 plt.figure(figsize=(10,5))
5 sns.distplot(df.pressureInd[df.broken==1])
6 sns.distplot(df.pressureInd[df.broken==0])
7 plt.legend(['0','1'])
8 plt.show()
```

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

warnings.warn("The 'normed' kwarg is deprecated, and has been "

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

warnings.warn("The 'normed' kwarg is deprecated, and has been "



Note : pressure is not an affecting factor.

In [299]:

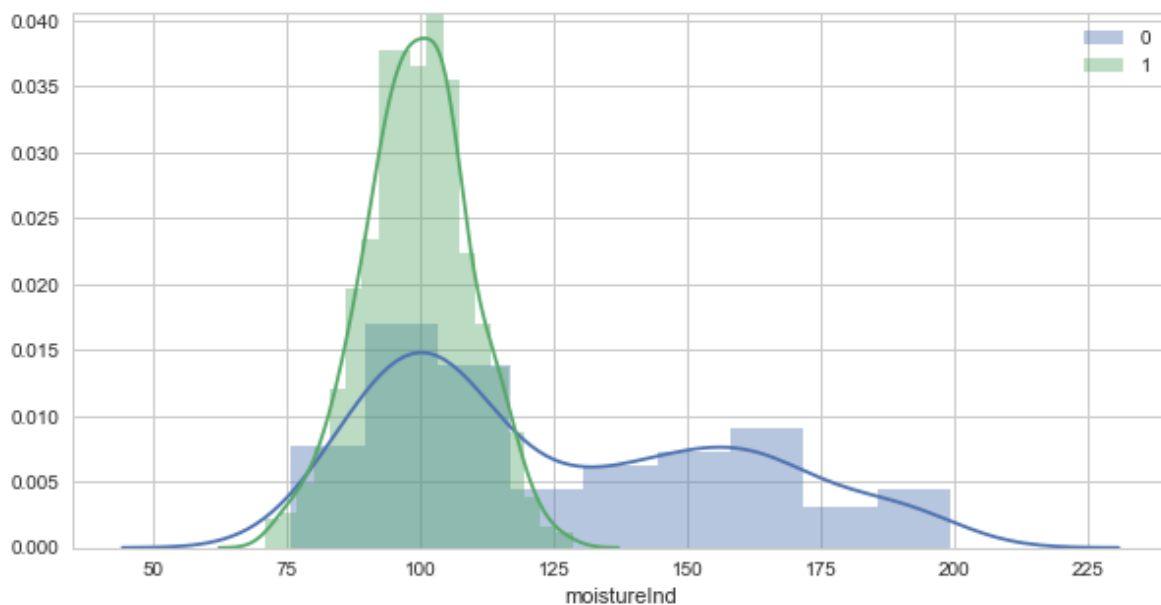
```
1
2 #numerical vs categorical
3
4 plt.figure(figsize=(10,5))
5 sns.distplot(df.moistureInd[df.broken==1])
6 sns.distplot(df.moistureInd[df.broken==0])
7 plt.legend(['0','1'])
8 plt.show()
```

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

warnings.warn("The 'normed' kwarg is deprecated, and has been "

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

warnings.warn("The 'normed' kwarg is deprecated, and has been "



Note: Moisture is an affecting factor.

In [300]:

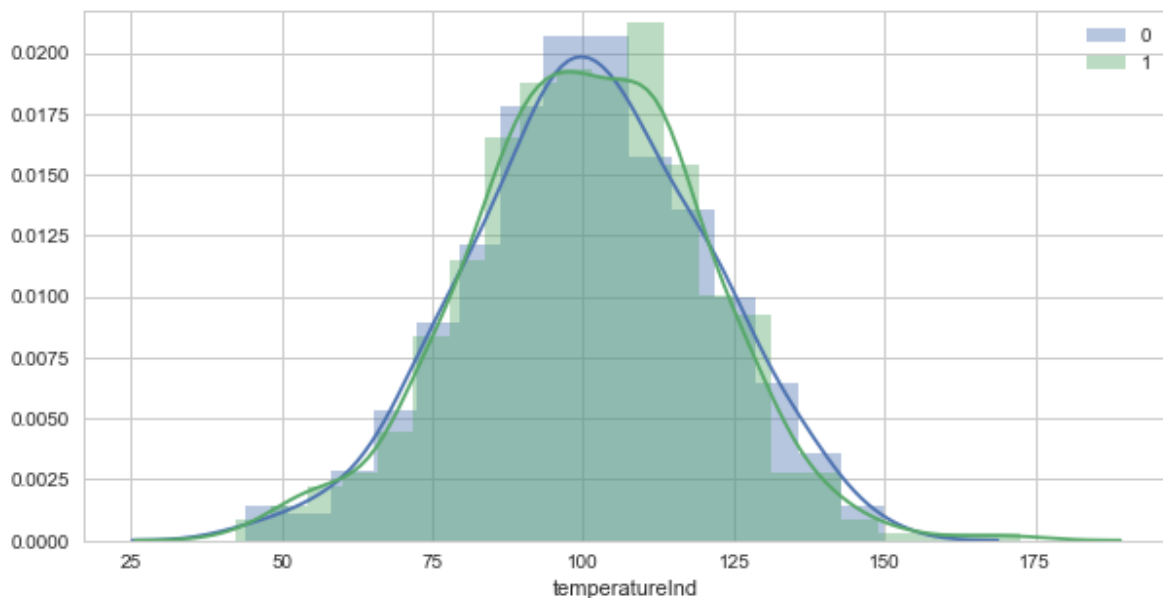
```
1
2
3 #numerical vs categorical
4
5 plt.figure(figsize=(10,5))
6 sns.distplot(df.temperatureInd[df.broken==1])
7 sns.distplot(df.temperatureInd[df.broken==0])
8 plt.legend(['0','1'])
9 plt.show()
```

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

warnings.warn("The 'normed' kwarg is deprecated, and has been "

C:\ProgramData\Anaconda3\lib\site-packages\matplotlib\axes_axes.py:6462: UserWarning: The 'normed' kwarg is deprecated, and has been replaced by the 'density' kwarg.

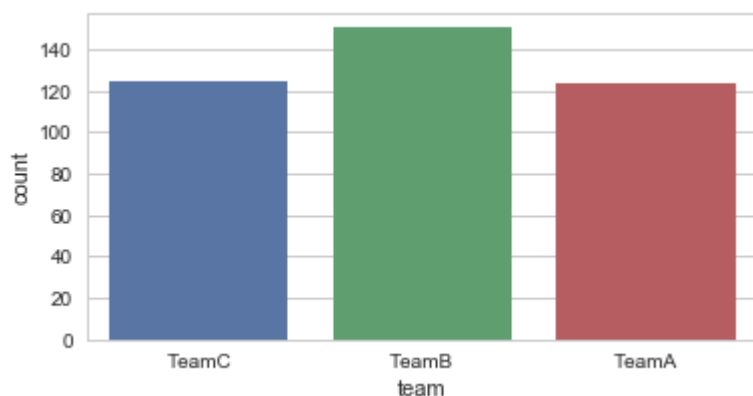
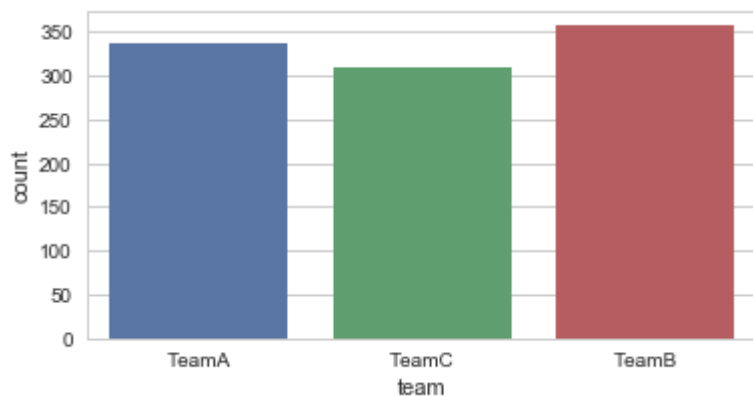
warnings.warn("The 'normed' kwarg is deprecated, and has been "



Note: Temperature is not an affecting factor.

In [301]:

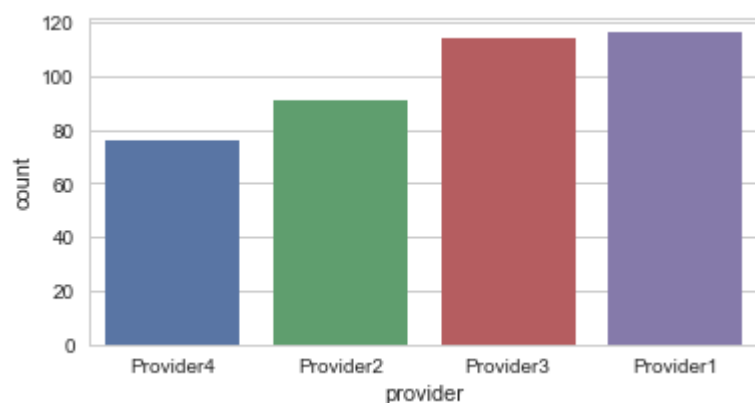
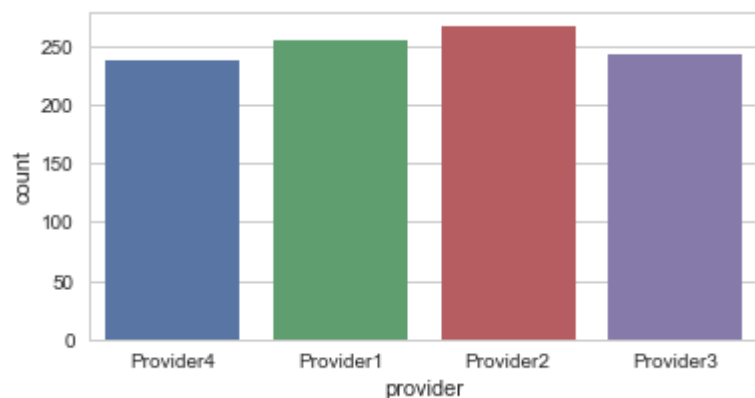
```
1 #categorical vs categorical
2
3 plt.figure(figsize=(6,3))
4 sns.countplot(df["team"])
5
6 plt.show()
7 plt.figure(figsize=(6,3))
8 sns.countplot(df["team"][df.broken==1])
9 plt.show()
10
11
```



Note : From the above comparison, it could be concluded the machine is broken irrespective of the team.

In [302]:

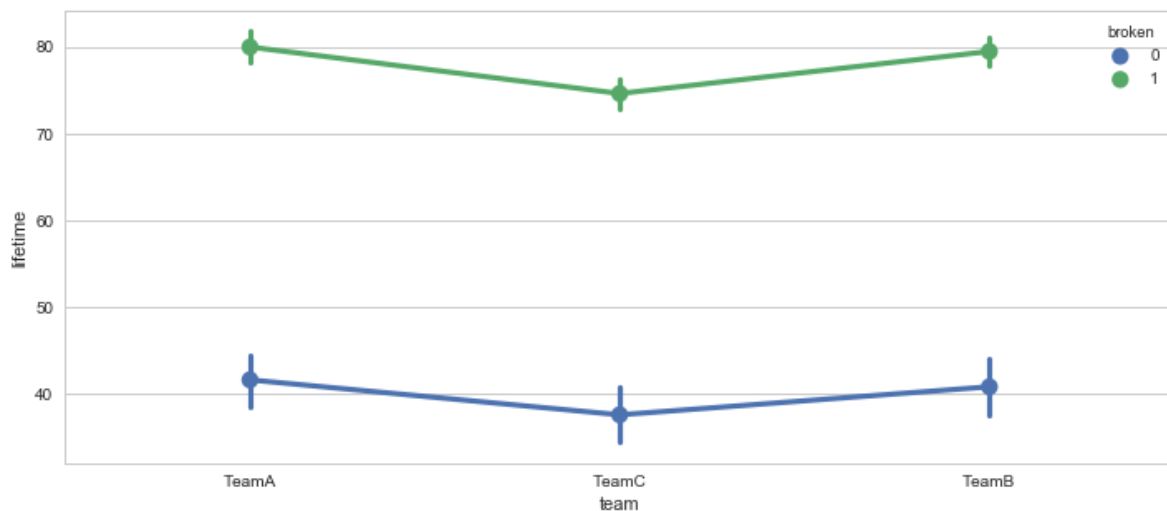
```
1 #categorical vs categorical
2
3 plt.figure(figsize=(6,3))
4 sns.countplot(df["provider"])
5
6 plt.show()
7 plt.figure(figsize=(6,3))
8 sns.countplot(df["provider"][df.broken==1])
9 plt.show()
10
11
```



Note : Provider 4 has less number of damaged machines in contrast to other providers.

In [303]:

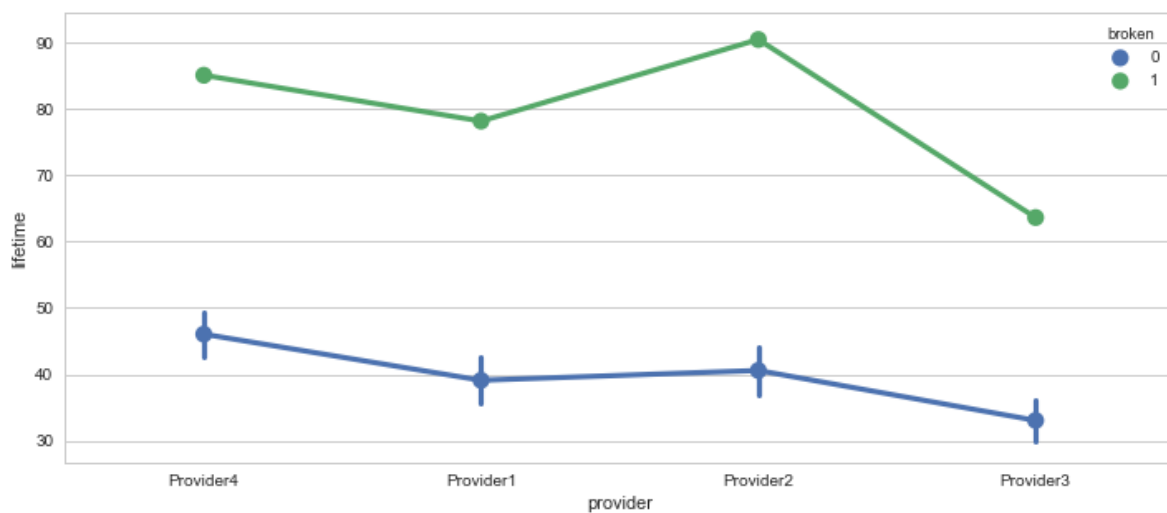
```
1 plt.figure(figsize=(12,5))
2 sns.pointplot(y='lifetime',x='team',hue='broken',data=df)
3 plt.show()
```



Note:

In [304]:

```
1 plt.figure(figsize=(12,5))
2 sns.pointplot(y='lifetime',x='provider',hue='broken',data=df)
3 plt.show()
```



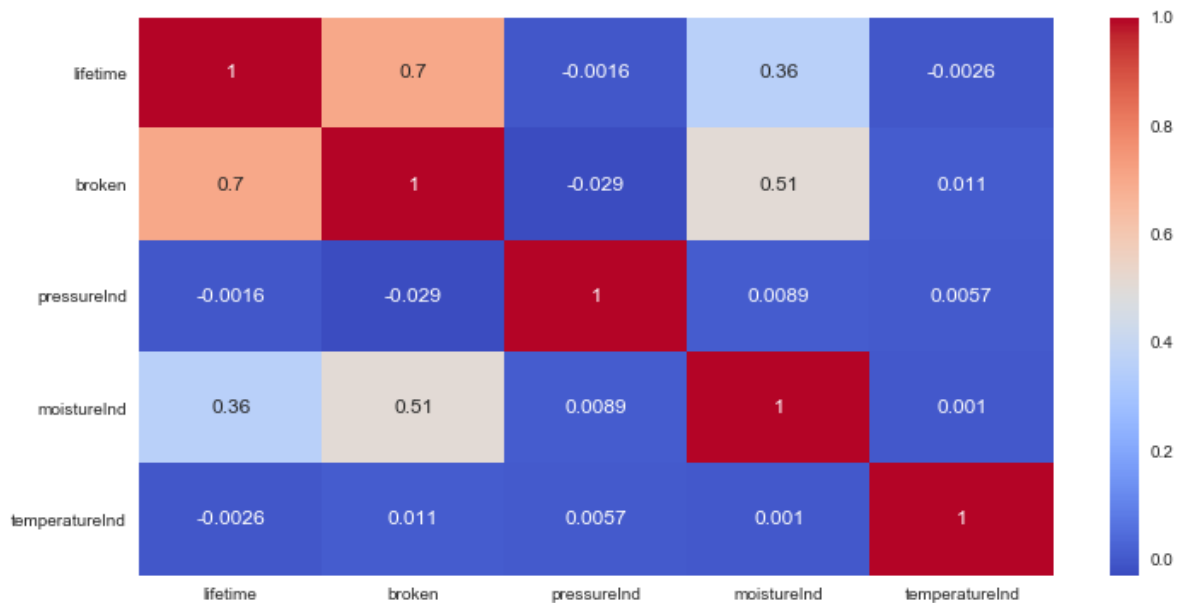
Note:

In [305]:

```

1 cor = df.corr()
2 plt.figure(figsize=(12,6))
3 sns.heatmap(cor,annot=True,cmap='coolwarm')
4 plt.show()

```



In [306]:

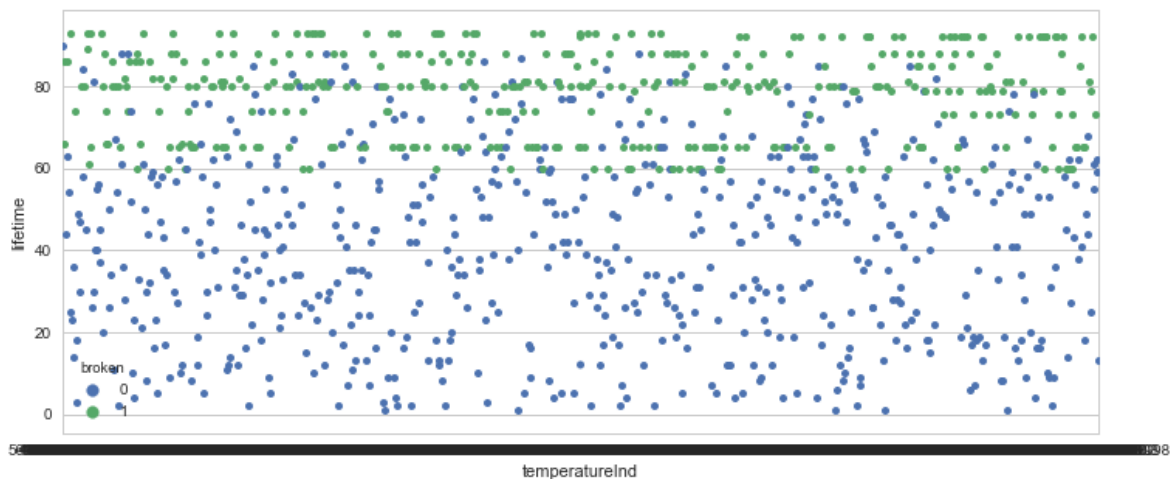
```

1 plt.figure(figsize=(12,5))
2 ax = sns.swarmplot(x='temperatureInd',y='lifetime',hue='broken',data=df)
3 ax

```

Out[306]:

<matplotlib.axes._subplots.AxesSubplot at 0x1efeff7db00>



In [307]:

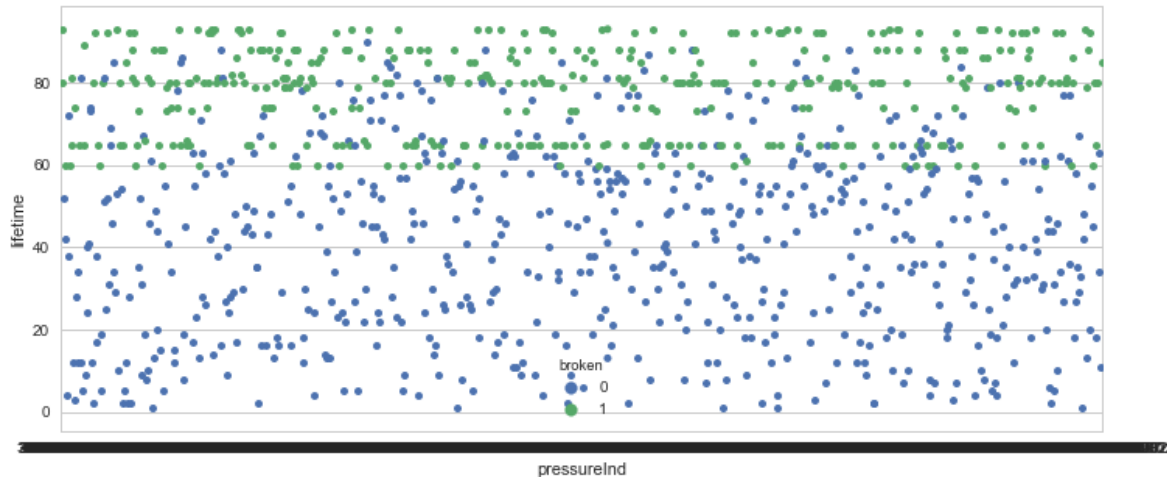
```

1 plt.figure(figsize=(12,5))
2 ax = sns.swarmplot(x='pressureInd',y='lifetime',hue='broken',data=df)
3 ax

```

Out[307]:

<matplotlib.axes._subplots.AxesSubplot at 0x1efefffaf28>



In [308]:

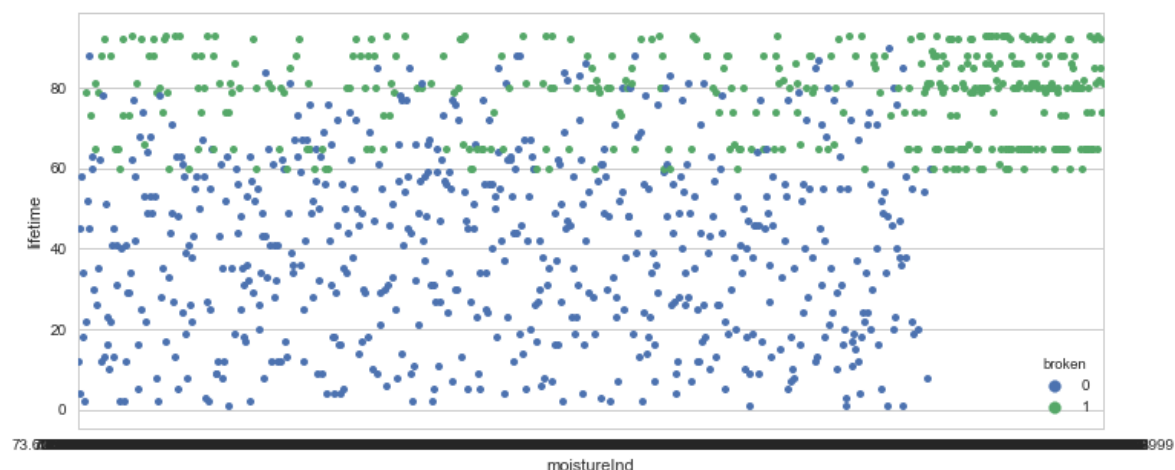
```

1 plt.figure(figsize=(12,5))
2 ax = sns.swarmplot(x='moistureInd',y='lifetime',hue='broken',data=df)
3 ax

```

Out[308]:

<matplotlib.axes._subplots.AxesSubplot at 0x1efeed74400>



Note : From the above plots, it can be observed that lifetime plays a major role in damage of machines. Machine between age of 60-80 are more likely to get damaged.

Conclusion :

From all the above graphs and the various univariate, multivariate and bivariate analysis it can be concluded that the lifetime of machines is an affecting factor why machines are getting damaged. It also seems plausible

and logical for machines to have wear and tear, and damaged, as they are used for more duration. Machines between lifetime 60 and above are likely to get damaged/broken. It is required to take good care of machines after the age of around 60 to prevent more loss.

In []:

1	
---	--