# Titanic

#### 2020年12月24日

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# 1 タイタニック号

 $https://ja.wikipedia.org/wiki/\%E3\%82\%BF\%E3\%82\%A4\%E3\%82\%BF\%E3\%83\%88B\%E3\%83\%83\%E3\%82\%AF\_(\%E5\%AE\%A2\%BF\%E3\%82\%BF\%E3\%82\%BF\%E3\%83\%88B\%E3\%83\%83\%E3\%82\%AF\%E5\%8F\%B7\%E6\%BF\%E3\%82\%BF\%E3\%82\%BF\%E3\%83\%83\%83\%E3\%82\%AF\%E5\%8F\%B7\%E6\%BF\%E3\%82\%BF\%E3\%82\%BF\%E3\%83\%83\%BB\%E3\%83\%83\%E3\%82\%AF\%E5\%8F\%B7\%E6\%BF\%E3\%82\%BF\%E3\%83\%82\%BF\%E3\%83\%83\%BB\%E3\%83\%83\%E3\%82\%AF\%E5\%BF\%E3\%82\%BF\%E3\%82\%BF\%E3\%83\%83\%BB\%E3\%83\%BB\%E3\%83\%BB\%E3\%83\%BF\%E3\%BF\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%BF\%E3\%BF\%BF\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%BF\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%E3\%BF\%BF\%E3\%BF\%BF$WF$$$$ 

```
[1]: import IPython.display
IPython.display.YouTubeVideo('CHekzSiZjrY', width=960, height=540)
```

[1]:



| 変数名              | Definition   | Key  |
|------------------|--------------|--|
| survival         | 生存状況         | 0 = No, 1 = Yes                                      |
| pclass           | チケットクラス      | $1 = -$ \\$, $2 = \bot$ \$, $3 = 3$ \$               |
| sex              | 性別           |  |
| Age              | 年齢           |  |
| sibsp            | 同乗した兄弟や配偶者の数 |  |
| parch            | 同乗した親や子の数    |  |
| ticket           | チッケット番号      |  |
| fare             | 旅客運賃         |  |
| cabin            | 船室番号         |  |
| ${\it embarked}$ | 乗船港          | C=Cherbourg (仏・シェルブール), $Q=Queenstown,S=Southampton$ |

### 1.1 乗船港

```
[140]: import folium

Cherbourg = [49.63, -1.62]
Queenstown = [51.851, -8.2967]
Southampton = [50.89696, -1.40416]
center = [(x+y+z)/3 for (x, y, z) in zip(Cherbourg, Queenstown, Southampton)]
# center = [45, 5]

m = folium.Map(location=center, tiles='Stamen Terrain', zoom_start=6)
```

```
folium.Marker(location=Cherbourg, popup='<b>Cherbourg</b>').add_to(m)
folium.Marker(location=Queenstown, popup='<b>Queenstown</b>').add_to(m)
folium.Marker(location=Southampton, popup='<b> Southampton</b>').add_to(m)
m
```

[140]: <folium.folium.Map at 0x7f9cc20b9510>

#### 1.2 Init

```
[5]: import numpy as np
  import pandas as pd
  # pd.set_option('display.max_rows')
  import matplotlib.pyplot as plt
  import seaborn as sns
  sns.set(style='darkgrid', font_scale = 1.8)
  plt.rcParams['figure.dpi'] = 300
  %matplotlib inline
```

#### 1.3 Load

```
[6]: df = pd.read_csv("./data/train.csv")
```

```
[43]: titanic = sns.load_dataset("titanic")
```

#### 1.4 データの様子

[7]: <pandas.io.formats.style.Styler at 0x7f9cbe0f8650>

```
[29]: # 敬称を抽出する関数

def Title(name):
    ret = 'Other'
    target = name.split(" ")
    for i in range(len(target)):
        if "." in target[i]:
            ret = target[i]
            break
    return ret
```

```
[30]: df['Title'] = df['Name'].apply(Title)
```

```
[26]: df['Title'].unique()
```

```
[26]: array(['Mr.', 'Mrs.', 'Miss.', 'Master.', 'Don.', 'Rev.', 'Dr.', 'Mme.',
             'Ms.', 'Major.', 'Lady.', 'Sir.', 'Mlle.', 'Col.', 'Capt.',
             'Countess.', 'Jonkheer.'], dtype=object)
      df.info()
[31]:
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 891 entries, 0 to 890
     Data columns (total 13 columns):
                        Non-Null Count Dtype
          Column
      0
          PassengerId
                        891 non-null
                                         int64
      1
          Survived
                        891 non-null
                                         int64
          Pclass
                        891 non-null
                                         int64
      3
          Name
                        891 non-null
                                         object
      4
          Sex
                        891 non-null
                                         object
      5
                        714 non-null
                                         float64
          Age
      6
          SibSp
                        891 non-null
                                         int64
      7
          Parch
                        891 non-null
                                         int64
      8
          Ticket
                        891 non-null
                                         object
      9
          Fare
                        891 non-null
                                         float64
          Cabin
      10
                        204 non-null
                                         object
      11 Embarked
                        889 non-null
                                         object
      12 Title
                        891 non-null
                                         object
     dtypes: float64(2), int64(5), object(6)
     memory usage: 90.6+ KB
[32]: df.describe(include='all')
[32]:
              PassengerId
                                             Pclass \
                              Survived
                                        891.000000
               891.000000
                            891.000000
      count
                                                NaN
      unique
                       NaN
                                   NaN
      top
                       NaN
                                   NaN
                                                NaN
                                                NaN
      freq
                       NaN
                                   NaN
               446.000000
                              0.383838
                                           2.308642
      mean
      std
               257.353842
                              0.486592
                                           0.836071
      min
                 1.000000
                              0.000000
                                           1.000000
               223.500000
      25%
                              0.000000
                                           2.000000
      50%
               446.000000
                              0.000000
                                           3.000000
               668.500000
                                           3.000000
      75%
                              1.000000
                                           3.000000
               891.000000
                              1.000000
      max
                                                                           SibSp
                                             Name
                                                    Sex
                                                                 Age
      count
                                              891
                                                    891
                                                         714.000000
                                                                      891.000000
      unique
                                              891
                                                      2
                                                                 NaN
                                                                             NaN
              Kenyon, Mrs. Frederick R (Marion)
                                                   male
                                                                 NaN
                                                                             NaN
      top
      freq
                                                1
                                                    577
                                                                 NaN
                                                                             NaN
```

NaN

29.699118

0.523008

 ${\tt NaN}$ 

mean

```
std
                                                NaN
                                                      NaN
                                                             14.526497
                                                                           1.102743
                                                      NaN
                                                              0.420000
                                                                           0.000000
      min
                                                NaN
      25%
                                                             20.125000
                                                                           0.00000
                                                NaN
                                                      NaN
      50%
                                                             28.000000
                                                                           0.000000
                                                {\tt NaN}
                                                      NaN
      75%
                                                                           1.000000
                                                NaN
                                                      NaN
                                                             38.000000
                                                             80.000000
                                                                           8.000000
      max
                                                NaN
                                                      NaN
                    Parch Ticket
                                           Fare
                                                    Cabin Embarked Title
                                                      204
                                                                889
                                                                       891
               891.000000
                               891
                                     891.000000
      count
                                681
                                                                  3
                                                                        17
      unique
                       NaN
                                            {\tt NaN}
                                                      147
                                                  B96 B98
                                                                  S
      top
                       NaN
                            347082
                                            {\tt NaN}
                                                                       Mr.
                       NaN
                                  7
                                            NaN
                                                                644
                                                                       517
      freq
      mean
                 0.381594
                               NaN
                                      32.204208
                                                      NaN
                                                                NaN
                                                                       NaN
                 0.806057
                               NaN
                                      49.693429
                                                      NaN
                                                                NaN
                                                                       NaN
      std
                 0.000000
                                       0.000000
      min
                               NaN
                                                      NaN
                                                                NaN
                                                                       NaN
      25%
                 0.000000
                               NaN
                                       7.910400
                                                      NaN
                                                                NaN
                                                                       NaN
      50%
                 0.000000
                               NaN
                                      14.454200
                                                      NaN
                                                                NaN
                                                                       NaN
      75%
                 0.000000
                               NaN
                                      31.000000
                                                      NaN
                                                                NaN
                                                                       NaN
      max
                 6.000000
                               NaN
                                     512.329200
                                                      NaN
                                                                NaN
                                                                       NaN
[33]:
      df.drop(['PassengerId', 'Name', 'Ticket', 'Cabin'], axis=1, inplace=True)
[34]: df[['Survived', 'Pclass']] = df[['Survived', 'Pclass']].astype(str)
     1.5 欠損値
[35]:
      df.isna().sum()
[35]: Survived
                      0
                      0
      Pclass
      Sex
                     0
                   177
      Age
      SibSp
                      0
      Parch
                      0
      Fare
                      0
      Embarked
                      2
      Title
                      0
      dtype: int64
[36]: df[df.isna().sum(axis=1)>0].head()
[36]:
         Survived Pclass
                                          SibSp
                                                  Parch
                                                             Fare Embarked Title
                               Sex
                                     Age
      5
                 0
                         3
                              male
                                     {\tt NaN}
                                               0
                                                      0
                                                           8.4583
                                                                          Q
                                                                                Mr.
      17
                 1
                         2
                                     NaN
                                                      0
                                                          13.0000
                                                                          S
                                                                                Mr.
                              male
                                                           7.2250
                                                                          С
      19
                 1
                         3
                           female
                                     NaN
                                               0
                                                      0
                                                                              Mrs.
                                                           7.2250
                                                                          С
      26
                 0
                         3
                              male
                                     NaN
                                               0
                                                      0
                                                                                Mr.
      28
                 1
                         3
                           female
                                     NaN
                                               0
                                                      0
                                                           7.8792
                                                                          Q
                                                                             Miss.
```

```
[37]: df.dropna(subset=['Embarked'], inplace=True)
```

### 2 単変量分析

```
[38]: print(df.columns.values)

['Survived' 'Pclass' 'Sex' 'Age' 'SibSp' 'Parch' 'Fare' 'Embarked' 'Title']

[39]: cat = ['Survived', 'Pclass', 'Sex', 'Embarked', 'Title']
    num = ['Age', 'SibSp', 'Parch', 'Fare']
    print('NOE: cat=', len(cat))
    print('NOE: num=', len(num))

NOE: cat = 5
    NOE: num = 4
```

#### 2.1 質的変数

```
[40]: df[cat].describe()
```

```
[40]:
            Survived Pclass
                             Sex Embarked Title
                 889
                             889
                                      889
                        889
                                            889
     count
     unique
                   2
                          3
                                        3
                                             17
                  0
                         3
                            male
                                        S Mr.
     top
                        491
                 549
                              577
                                      644 517
     freq
```

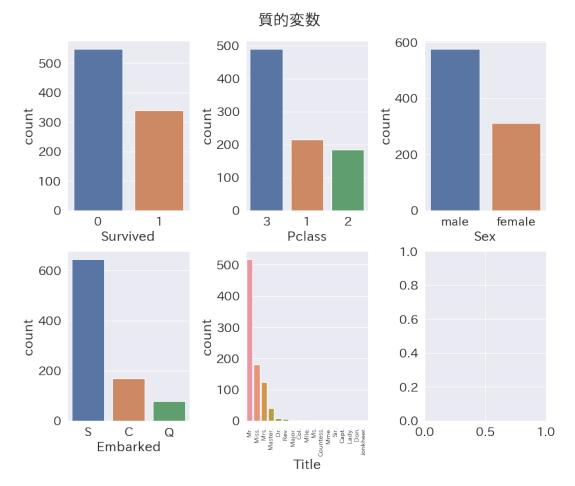
#### 2.2 量的変数

```
[41]: round(df[num].describe())
```

```
[41]:
             Age SibSp Parch
                               Fare
     count 712.0 889.0 889.0 889.0
            30.0
     mean
                   1.0
                         0.0
                               32.0
     std
            14.0
                   1.0
                        1.0
                              50.0
            0.0
                        0.0
                               0.0
     min
                   0.0
     25%
            20.0
                  0.0
                        0.0
                              8.0
     50%
            28.0
                        0.0
                              14.0
                   0.0
     75%
            38.0
                   1.0
                          0.0
                              31.0
            80.0
                   8.0
                          6.0 512.0
     max
```

#### 2.3 質的変数の棒グラフ

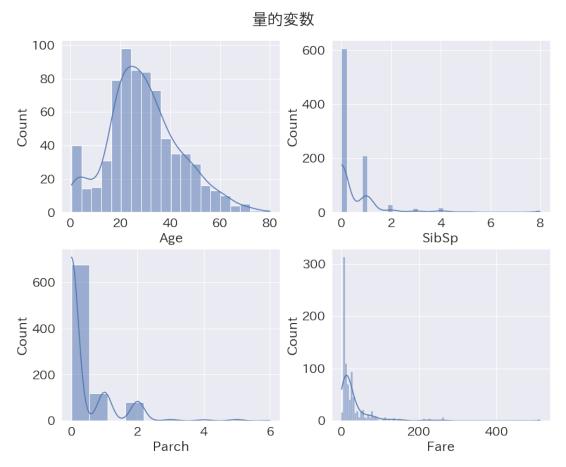
```
[60]: nor, noc = 2, 3
fig, axs = plt.subplots(nor, noc, figsize=(12, 10))
for i in range(nor):
    for j in range(noc):
        k = noc*i + j
```



#### 2.4 量的変数のヒストグラム

```
[61]: nor, noc = 2, 2
fig, axs = plt.subplots(nor, noc, figsize=(12, 10))
for i in range(nor):
    for j in range(noc):
        k = noc*i + j
        if k < len(num):
            sns.histplot(x=num[k], kde=True, data=df, ax=axs[i, j])</pre>
```

```
fig.tight_layout()
fig.suptitle('量的変数', fontsize=25)
fig.subplots_adjust(top=0.92)
plt.show()
```



## 3 多変量分析

### 3.1 質的変数:の積み上げ棒グラフ

```
fig, axs = plt.subplots(nor, noc, figsize=(12, 10))

for i in range(nor):
    for j in range(noc):
        k = noc*i + j
        sns.histplot(data=df, x=['Pclass', 'Sex', 'Embarked', 'Title'][k], hue='Survived',
        multiple='stack', shrink=.8, ax=axs[i, j])

fig.tight_layout()

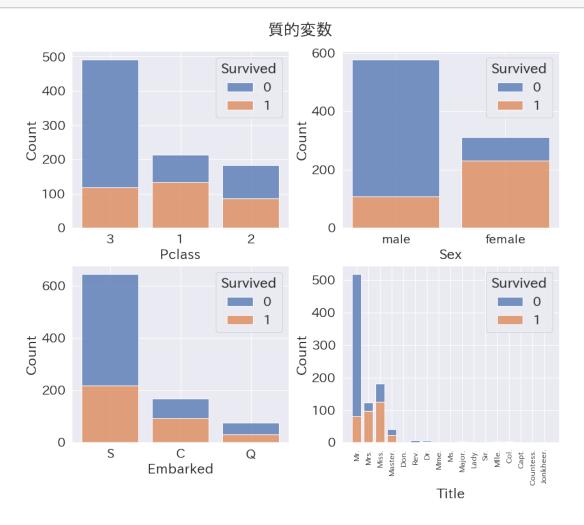
fig.suptitle('質的変数', fontsize=25)

fig.subplots_adjust(top=0.92)

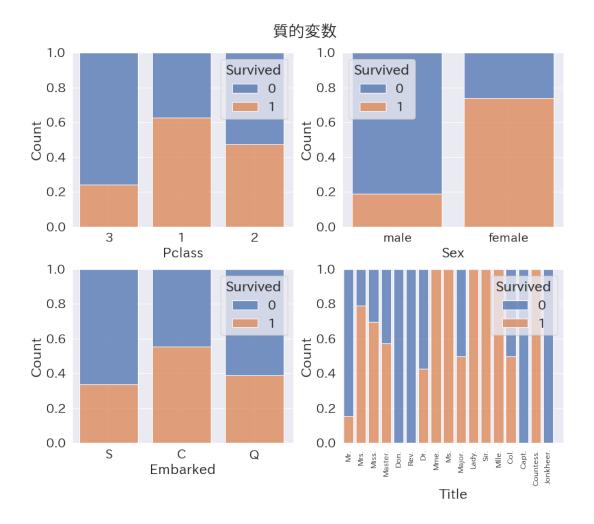
labels = axs[1,1].get_xticklabels()

plt.setp(labels, rotation=90, fontsize=12)
```

plt.show()

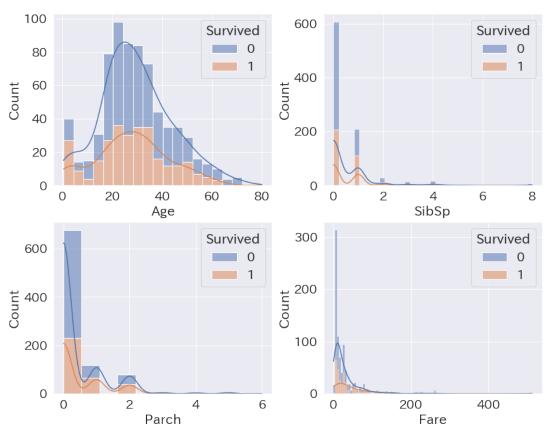


#### 3.2 量的変数:100 %積み上げ棒グラフ



### 3.3 量的変数:ヒストグラム

## 量的変数



#### 3.4 量的変数:100 %積み上げ棒グラフ

```
fig, axs = plt.subplots(nor, noc, figsize=(12, 10))

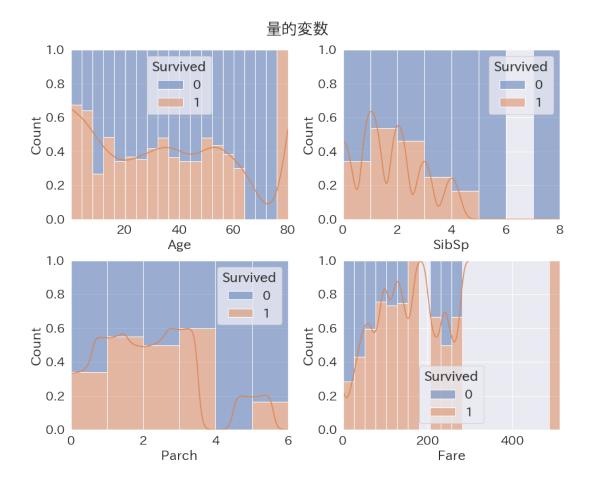
for i in range(nor):
    for j in range(noc):
        k = noc*i + j
        if k < len(num):
            sns.histplot(x=num[k], hue='Survived', multiple='fill', bins=[20,8,6,20][k],
            -kde=True, data=df, ax=axs[i, j])

fig.tight_layout()

fig.suptitle('量的变数', fontsize=25)

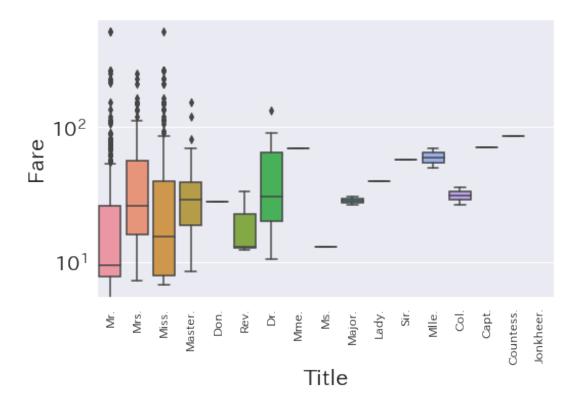
fig.subplots_adjust(top=0.92)

plt.show()
```



## 3.5 箱ヒゲ図

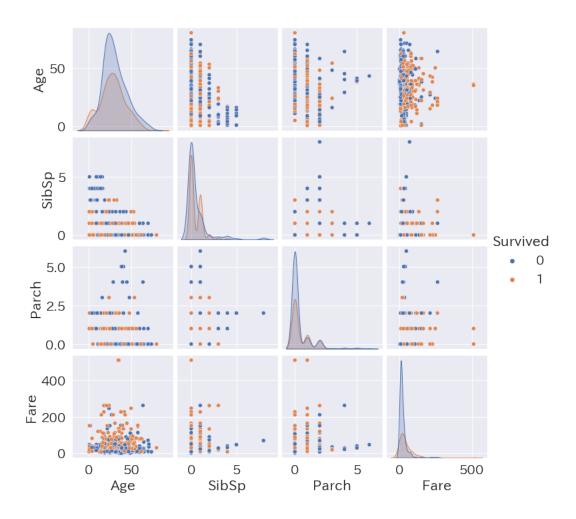
```
[152]: fig, ax = plt.subplots(figsize=(8, 5))
sns.boxplot(x='Title', y='Fare', data=df, ax=ax)
labels = ax.get_xticklabels()
ax.set_xticklabels(labels, rotation='vertical', fontsize=12)
ax.set_yscale("log")
plt.show()
```



# 3.6 散布図

```
[151]: sns.pairplot(df, hue="Survived", height=2.5)
```

[151]: <seaborn.axisgrid.PairGrid at 0x7ff907d46090>



## 3.7 相関係数



### 3.8 並行座標プロット