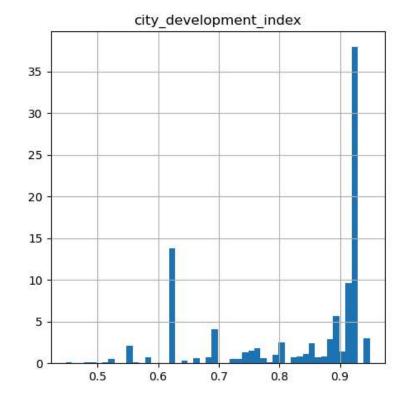
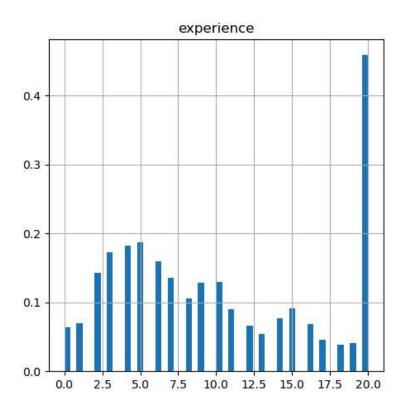
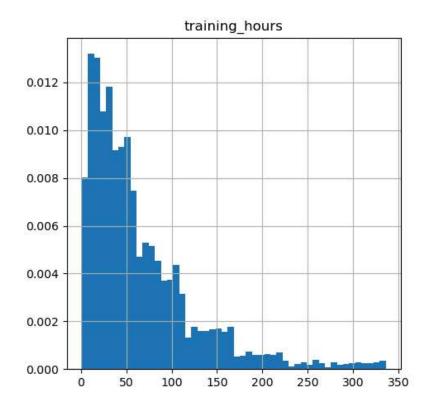
```
import pandas as pd
In [29]:
          import numpy as np
          import matplotlib.pyplot as plt
          df=pd.read_csv('job.csv')
 In [2]:
          df.head()
Out[2]:
             enrollee_id
                            city city_development_index gender relevent_experience enrolled_university educat
                                                                      Has relevent
          0
                  8949 city_103
                                                 0.920
                                                         Male
                                                                                       no_enrollment
                                                                        experience
                                                                       No relevent
          1
                 29725
                         city_40
                                                 0.776
                                                         Male
                                                                                       no_enrollment
                                                                        experience
                                                                       No relevent
          2
                 11561
                                                 0.624
                         city_21
                                                          NaN
                                                                                      Full time course
                                                                        experience
                                                                       No relevent
          3
                 33241 city_115
                                                 0.789
                                                          NaN
                                                                                               NaN
                                                                        experience
                                                                      Has relevent
          4
                   666 city_162
                                                 0.767
                                                         Male
                                                                                       no_enrollment
                                                                        experience
          df.isnull().sum()
 In [7]:
                                          0
          enrollee_id
Out[7]:
          city
                                          0
          city_development_index
                                       479
          gender
                                       4508
          relevent_experience
                                          0
          enrolled_university
                                        386
          education level
                                       460
          major_discipline
                                       2813
          experience
                                         65
          company_size
                                       5938
          company_type
                                      6140
          training_hours
                                        766
          target
                                          0
          dtype: int64
          df.isnull().mean()*100
 In [8]:
          enrollee_id
                                       0.000000
Out[8]:
          city
                                       0.000000
          city_development_index
                                       2.500261
          gender
                                       23.530640
          relevent_experience
                                       0.000000
          enrolled_university
                                        2.014824
          education_level
                                        2.401086
          major_discipline
                                      14.683161
          experience
                                       0.339284
          company_size
                                       30.994885
          company_type
                                       32.049274
          training_hours
                                        3.998330
          target
                                       0.000000
          dtype: float64
          df.shape
 In [9]:
          (19158, 13)
Out[9]:
In [10]:
          df.columns
          Index(['enrollee_id', 'city', 'city_development_index', 'gender',
Out[10]:
                  'relevent_experience', 'enrolled_university', 'education_level',
                  'major_discipline', 'experience', 'company_size', 'company_type',
                  'training_hours', 'target'],
                 dtype='object')
```

```
# kun chai column ma 5% vanda kam data missing cha tyo khojeko
In [13]:
          col=[]
          for colum in df.columns:
               if df[colum].isnull().mean()>0 and df[colum].isnull().mean()<0.05:</pre>
                   col.append(colum)
          col
          ['city_development_index',
Out[13]:
           'enrolled_university',
           'education_level',
           'experience',
           'training hours']
In [15]:
          df[col].sample(7)
                 city_development_index enrolled_university education_level experience training_hours
Out[15]:
           1972
                                  0.884
                                           Part time course
                                                                               20.0
                                                                                               6.0
                                                                Graduate
           6585
                                  0.920
                                             no_enrollment
                                                                Graduate
                                                                                3.0
                                                                                             125.0
          17611
                                  0.855
                                            Full time course
                                                              High School
                                                                                4.0
                                                                                              17.0
                                  0.924
           9019
                                                                               14.0
                                             no_enrollment
                                                                Graduate
                                                                                              26.0
                                  0.624
           7746
                                                     NaN
                                                                    NaN
                                                                                5.0
                                                                                              98.0
                                  0.487
           6712
                                             no_enrollment
                                                                 Masters
                                                                               19.0
                                                                                              52.0
                                  0.897
                                            Full time course
                                                                                              86.0
          10197
                                                                 Masters
                                                                                5.0
          df[col].isna().sum()
In [20]:
          city_development_index
                                       479
Out[20]:
          enrolled_university
                                       386
          education_level
                                       460
          experience
                                       65
          training_hours
                                       766
          dtype: int64
          total=0
In [22]:
          for x in col:
               total=total+df[x].isna().sum()
          total
          2156
Out[22]:
          len(df)
In [18]:
          19158
Out[18]:
          1-(2156/19158) # yedi null value vayeko column hatayo vane 88% data baki huneracha
In [24]:
          0.8874621568013362
Out[24]:
In [26]:
          new_data=df[col].dropna() # 5% data missing dataframe bata all null remove gardeko
          df.shape, new_data.shape
          ((19158, 13), (17182, 5))
Out[26]:
          #histogram plot
In [27]:
          new_data.hist(bins=50, density=True,figsize=(12,12))
In [30]:
          plt.show()
```







```
In [36]: case1=df['enrolled_university'].value_counts()/len(df)
    case1
```

Out[36]: no_enrollment 0.721213 Full time course 0.196106 Part time course 0.062533

Name: enrolled_university, dtype: float64

Out[37]: no_enrollment 0.735188 Full time course 0.200733 Part time course 0.064079

Name: enrolled_university, dtype: float64

In [43]: comparision=pd.concat([case1,case2],names=['case1','case2'],axis=1)
 comparision

Out[43]: enrolled_university enrolled_university

no_enrollment	0.721213	0.735188
Full time course	0.196106	0.200733
Part time course	0.062533	0.064079

If ratio is same before removing missing value and after removing missing value then it is missing value at random. If ratio is not same then we cannot remove missing value ,rather we should try to fill those value with imputation techniques