## Excercises Ch1

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# 1 Hands-On Data Preprocessing in Python

Learn how to effectively prepare data for successful data analytics

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## 1.0.1 Chapter 1: Review of the core modules NumPy, Pandas, and Matplotlib

**Excercise 1** Use the adult.csv dataset and run the codes shown in the following Screenshots. Then answer the questions.

```
[1]: import pandas as pd
import numpy as np
adult_df = pd.read_csv('adult.csv')
adult_df.set_index(np.arange(10000,42561),inplace=True)

print(adult_df.iloc[5:7,0:2])

print(adult_df.loc['10005':'10007','age':'fnlwgt'])
```

```
age workclass
10005
        37
             Private
10006
        49
             Private
                   workclass fnlwgt
       age
10005
        37
                     Private
                              284582
10006
        49
                     Private 160187
10007
        52
           Self-emp-not-inc
                              209642
```

- a) Use the output to answer what is the difference in the behavior of .loc and .iloc when it co
- b) Without running but by only looking at the data, what will be the output of adult\_df.loc['
- c) Without running but by only looking at the data, what will be the output of  $adult_df.iloc[$ 
  - a) iloc's lower bound is exclusive, loc's lower bound is inclusive
  - b) relationship race sex

    10000 Not-in-family White Male 10001 Husband White Male 10002 Not-in-family White Male
    10003 Husband Black Male
  - c) relationship race
    10000 Not-in-family White 10001 Husband White 10002 Not-in-family White

**Excercise 2** For adult\_df use the .groupby() function to run the following code and create the multi-index Series mlt\_sr.

```
[2]: import pandas as pd

adult_df = pd.read_csv('adult.csv')
mlt_seris =adult_df.groupby(['race','sex','income']).fnlwgt.mean()
mlt_seris
```

[2]:	race	sex	income	
	Amer-Indian-Eskimo	Female	<=50K	109018.626168
			>50K	148012.000000
		Male	<=50K	126428.767857
			>50K	120721.541667
	Asian-Pac-Islander	Female	<=50K	148165.333333
			>50K	142426.093023
		Male	<=50K	163885.130435
			>50K	170698.347639
	Black	Female	<=50K	213411.580205
			>50K	205806.033333
		Male	<=50K	242343.990566
			>50K	245390.356902
	Other	Female	<=50K	173235.932039
			>50K	160223.333333
		Male	<=50K	214891.832168
			>50K	204551.736842
	White	Female	<=50K	183485.120961
			>50K	184030.255837
		Male	<=50K	189950.465418
			>50K	186917.770077

Name: fnlwgt, dtype: float64

Now that you have created a multi-index Series, run the following codes, study the outputs, and answer the questions.

a) Run the code below first and then answer the following. When we use .iloc[] for a multi-in-

```
[3]: print(mlt_seris.iloc[0])
   print(mlt_seris.iloc[1])
   print(mlt_seris.iloc[2])
```

109018.6261682243

148012.0

126428.76785714286

Answer:

.iloc[] selects rows and columns by their integer positions

b) Run the code below first and then answer the following. When we use .loc[] to access the data

```
[5]: mlt_seris.loc['Other']
```

```
[5]: sex income
Female <=50K 173235.932039
>50K 160223.333333
Male <=50K 214891.832168
>50K 204551.736842
Name: fnlwgt, dtype: float64
```

#### Answer:

.loc selects data based on index labels, not positions.

c) Run the codes below first and then answer the following. When we use .loc[] to access the When you run either line of code below, you will get an error and that is the point of this qua

[6]: mlt seris.loc['Female']

```
Traceback (most recent call last)
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexes/base.py:
 →3805, in Index.get_loc(self, key)
   3804 try:
            return self._engine.get_loc(casted_key)
   3806 except KeyError as err:
File index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()
File index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()
File pandas/_libs/hashtable_class_helper.pxi:7081, in pandas._libs.hashtable.
 →PyObjectHashTable.get_item()
File pandas/_libs/hashtable_class_helper.pxi:7089, in pandas._libs.hashtable.
 →PyObjectHashTable.get_item()
KeyError: 'Female'
The above exception was the direct cause of the following exception:
                                          Traceback (most recent call last)
KeyError
Cell In[6], line 1
----> 1 mlt_seris.loc[
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 -data_preprocessing/lib/python3.11/site-packages/pandas/core/indexing.py:1191,
 →in _LocationIndexer.__getitem__(self, key)
```

```
1189 maybe_callable = com.apply_if_callable(key, self.obj)
   1190 maybe_callable = self._check_deprecated_callable_usage(key,_
 →maybe_callable)
-> 1191 return self._getitem_axis(maybe_callable, axis=axis)
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 →data_preprocessing/lib/python3.11/site-packages/pandas/core/indexing.py:1431,
 →in LocIndexer._getitem_axis(self, key, axis)
   1429 # fall thru to straight lookup
   1430 self._validate_key(key, axis)
-> 1431 return self._get_label(key, axis=axis)
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexing.py:1381,
 →in _LocIndexer._get_label(self, label, axis)
   1379 def _get_label(self, label, axis: AxisInt):
            # GH#5567 this will fail if the label is not present in the axis.
   1380
-> 1381
            return self.obj.xs(label, axis=axis)
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/generic.py:4293,
 →in NDFrame.xs(self, key, axis, level, drop_level)
   4290
            index = self.index
   4292 if isinstance(index, MultiIndex):
            loc, new_index = index._get_loc_level(key, level=0)
-> 4293
            if not drop_level:
   4294
   4295
                if lib.is_integer(loc):
   4296
                    # Slice index must be an integer or None
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexes/multi.py:
 →3290, in MultiIndex. get loc level(self, key, level)
                return indexer, maybe_mi_droplevels(indexer, ilevels)
   3289 else:
            indexer = self._get_level_indexer(key, level=level)
-> 3290
   3291
            if (
   3292
                isinstance(key, str)
                and self.levels[level]._supports_partial_string_indexing
   3293
   3294
            ):
   3295
                # check to see if we did an exact lookup vs sliced
   3296
                check = self.levels[level].get_loc(key)
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexes/multi.py:
 →3391, in MultiIndex._get_level_indexer(self, key, level, indexer)
                return slice(i, j, step)
   3388
   3390 else:
-> 3391
            idx = self._get_loc_single_level_index(level_index, key)
            if level > 0 or self. lexsort depth == 0:
   3393
```

```
3394
                # Desired level is not sorted
   3395
                if isinstance(idx, slice):
   3396
                    # test_get_loc_partial_timestamp_multiindex
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexes/multi.py:
 $\to 2980$, in MultiIndex. get loc single level index(self, level index, key)
            return -1
   2978
   2979 else:
            return level_index.get_loc(key)
-> 2980
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
 data_preprocessing/lib/python3.11/site-packages/pandas/core/indexes/base.py:
 ⇒3812, in Index.get loc(self, key)
   3807
            if isinstance(casted_key, slice) or (
                isinstance(casted_key, abc.Iterable)
   3808
                and any(isinstance(x, slice) for x in casted_key)
   3809
            ):
   3810
                raise InvalidIndexError(key)
   3811
-> 3812
            raise KeyError(key) from err
   3813 except TypeError:
            # If we have a listlike key, _check_indexing_error will raise
   3814
   3815
            # InvalidIndexError. Otherwise we fall through and re-raise
            # the TypeError.
   3816
            self. check indexing error(key)
   3817
KeyError: 'Female'
```

### [7]: mlt\_seris.loc['<=50K']

```
File pandas/_libs/hashtable_class_helper.pxi:7089, in pandas._libs.hashtable.
  →PyObjectHashTable.get_item()
KeyError: '<=50K'</pre>
The above exception was the direct cause of the following exception:
KeyError
                                           Traceback (most recent call last)
Cell In[7], line 1
----> 1 mlt seris.loc[
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            # GH#5567 this will fail if the label is not present in the axis.
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            index = self.index
   4292 if isinstance(index, MultiIndex):
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            loc, new_index = index._get_loc_level(key, level=0)
   4294
            if not drop_level:
   4295
                 if lib.is_integer(loc):
   4296
                     # Slice index must be an integer or None
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   3289 else:
            indexer = self._get_level_indexer(key, level=level)
-> 3290
```

```
3291
            if (
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   3293
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   3390 else:
-> 3391
            idx = self._get_loc_single_level_index(level_index, key)
            if level > 0 or self._lexsort_depth == 0:
   3393
   3394
                # Desired level is not sorted
                if isinstance(idx, slice):
   3395
                    # test get loc partial timestamp multiindex
   3396
File /run/media/weida/SSD1/Study Stuff/Hands-On Data Preprocessing in Python/
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   3814
            # InvalidIndexError. Otherwise we fall through and re-raise
   3815
   3816
            # the TypeError.
            self. check indexing error(key)
   3817
KeyError: '<=50K'</pre>
```

Answer:

error

d) Run the codes below first and then answer the following. How is using .loc[] or .iloc[] dis

```
[9]: print(mlt_seris.loc['Other']['Female']['<=50K'])
print(mlt_seris.iloc[12])</pre>
```

173235.93203883496 173235.93203883496

#### Answer:

Using .loc[] is label-based (selects by index names at any level), while .iloc[] is position-based (ignores index labels and selects by integer position).

Excercise 3 For this exercise you need to use a new dataset: billboard.csv. Visit https://www.billboard.com/charts/hot-100 and see the latest song rankings of the day. This dataset presents information and ranking of 317 song tracks in 80 columns. The first four columns are artist, track, time, and date\_e. The first columns are intuitive descriptions of song tracks. The column date\_e shows the date that the songs entered the hot-100 list. The rest of 76 columns are songs ranking at the end of each weeks from 'w1' to 'w76'. Download and read this dataset using pandas and answer the following questions.

```
[12]: import pandas as pd

billboard_df = pd.read_csv("billboard.csv")
billboard_df.head()
```

```
[12]:
                          artist
                                                                         track
                                                                                 time
       0
               Destiny's Child
                                                  Independent Women Part I
                                                                                 3:38
       1
                        Santana
                                                                Maria, Maria
                                                                                4:18
       2
                 Savage Garden
                                                         I Knew I Loved You
                                                                                 4:07
       3
                        Madonna
                                                                         Music
                                                                                 3:45
          Aguilera, Christina
                                   Come On Over Baby (All I Want Is You)
                                                                                 3:38
                               w2
                                       wЗ
                                                                          w68
                                                                                w69
               date e
                        w1
                                             w4
                                                    w5
                                                            w6
                                                                    w67
                                                                                     w70
                                                                                           w71
       0
          2000-09-23
                        78
                             63.0
                                    49.0
                                           33.0
                                                  23.0
                                                         15.0
                                                                    NaN
                                                                          NaN
                                                                                NaN
                                                                                     NaN
                                                                                           NaN
          2000-02-12
                        15
                              8.0
                                     6.0
                                            5.0
                                                   2.0
                                                          3.0
                                                                    NaN
                                                                          {\tt NaN}
                                                                                NaN
                                                                                     {\tt NaN}
                                                                                           NaN
       2
          1999-10-23
                        71
                             48.0
                                    43.0
                                           31.0
                                                  20.0
                                                         13.0
                                                                ...
                                                                    NaN
                                                                          NaN
                                                                                NaN
                                                                                     NaN
                                                                                           NaN
       3
          2000-08-12
                        41
                             23.0
                                    18.0
                                           14.0
                                                   2.0
                                                          1.0
                                                                    NaN
                                                                          {\tt NaN}
                                                                                NaN
                                                                                           NaN
                                                                                     NaN
          2000-08-05
                        57
                             47.0
                                    45.0
                                           29.0
                                                  23.0
                                                         18.0
                                                                    NaN
                                                                                NaN
                                                                          {\tt NaN}
                                                                                     {\tt NaN}
                                                                                           NaN
          w72
                w73
                      w74
                            w75
                                  w76
       0
          NaN
                NaN
                      NaN
                            NaN
                                  NaN
       1
          NaN
                NaN
                      NaN
                            NaN
                                  NaN
       2
          NaN
                NaN
                      NaN
                            NaN
                                  NaN
       3
          NaN
                NaN
                      NaN
                            NaN
                                  NaN
          NaN
                {\tt NaN}
                      NaN
                            NaN
                                  NaN
```

[5 rows x 80 columns]

a) Write one line of code that gives you a great idea of how many null values each column has

```
[17]: print(billboard_df.isnull().sum())
      billboard_df = billboard_df.dropna(axis=1, how='all')
     artist
                  0
     track
                  0
                  0
     time
     date_e
                  0
     w1
                  0
     w72
                317
     w73
                317
     w74
                317
     พ75
                317
     w76
                317
     Length: 80, dtype: int64
[19]: print(billboard_df.isnull().sum())
      billboard_df
     artist
     track
                  0
     time
                  0
     date_e
                  0
     w1
                  0
     w61
                315
     w62
                315
     w63
                315
     w64
                315
     w65
                316
     Length: 69, dtype: int64
[19]:
                         artist
                                                                     track time \
      0
                Destiny's Child
                                                Independent Women Part I
                                                                            3:38
      1
                         Santana
                                                             Maria, Maria 4:18
      2
                  Savage Garden
                                                       I Knew I Loved You 4:07
      3
                        Madonna
                                                                     Music 3:45
      4
           Aguilera, Christina Come On Over Baby (All I Want Is You)
                                                                             3:38
      312
               Ghostface Killah
                                                         Cherchez LaGhost
                                                                             3:04
      313
                    Smith, Will
                                                               Freakin' It
                                                                             3:58
      314
                  Zombie Nation
                                                            Kernkraft 400
                                                                             3:30
      315
                 Eastsidaz, The
                                                                  Got Beef
                                                                             3:58
      316
                                                           Toca's Miracle 3:22
                         Fragma
                                            w4
                date_e w1
                               w2
                                     wЗ
                                                  w5
                                                         w6
                                                               w56
                                                                      พ57
                                                                           w58
                                                                                 w59
      0
           2000-09-23 78
                             63.0
                                   49.0
                                               23.0
                                                       15.0 ...
                                          33.0
                                                                \mathtt{NaN}
                                                                      NaN
                                                                           {\tt NaN}
                                                                                 {\tt NaN}
      1
           2000-02-12 15
                              8.0
                                                 2.0
                                     6.0
                                           5.0
                                                        3.0 ...
                                                                 {\tt NaN}
                                                                      {\tt NaN}
                                                                           {\tt NaN}
                                                                                 NaN
```

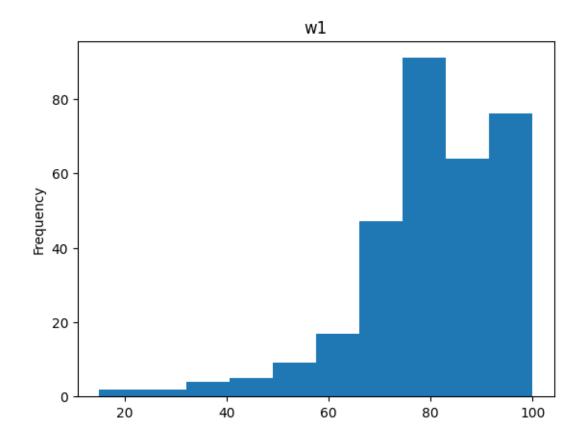
```
2
      1999-10-23 71
                          48.0
                                 43.0
                                         31.0
                                                 20.0
                                                        13.0
                                                                    NaN
                                                                                       NaN
                                                                          NaN
                                                                                 NaN
3
      2000-08-12
                          23.0
                                                  2.0
                     41
                                  18.0
                                         14.0
                                                          1.0
                                                                    NaN
                                                                          NaN
                                                                                 NaN
                                                                                       NaN
4
      2000-08-05
                     57
                          47.0
                                  45.0
                                         29.0
                                                 23.0
                                                         18.0
                                                                    NaN
                                                                          NaN
                                                                                 NaN
                                                                                       NaN
. .
     2000-08-05 98
                                                                                       NaN
312
                           NaN
                                   NaN
                                           NaN
                                                  NaN
                                                          NaN
                                                                    NaN
                                                                          NaN
                                                                                 NaN
313
      2000-02-12
                     99
                          99.0
                                  99.0
                                         99.0
                                                  NaN
                                                          {\tt NaN}
                                                                    NaN
                                                                          NaN
                                                                                 NaN
                                                                                       NaN
314
     2000-09-02
                          99.0
                                                                                       NaN
                     99
                                   {\tt NaN}
                                           NaN
                                                  {\tt NaN}
                                                          \mathtt{NaN}
                                                                    NaN
                                                                          NaN
                                                                                 NaN
315
     2000-07-01
                     99
                          99.0
                                   NaN
                                          NaN
                                                  NaN
                                                          NaN
                                                                    NaN
                                                                          NaN
                                                                                 {\tt NaN}
                                                                                       NaN
316
     2000-10-28
                     99
                           NaN
                                   NaN
                                          NaN
                                                  {\tt NaN}
                                                                          NaN
                                                                                       NaN
                                                          {\tt NaN}
                                                                    NaN
                                                                                 \mathtt{NaN}
      w60
            w61
                  w62
                         w63
                               w64
                                     w65
0
      NaN
            NaN
                  NaN
                         NaN
                               NaN
                                     NaN
1
      {\tt NaN}
            NaN
                  NaN
                         NaN
                               NaN
                                     NaN
2
      {\tt NaN}
            {\tt NaN}
                  NaN
                         NaN
                               NaN
                                     NaN
3
            {\tt NaN}
                  NaN
      NaN
                         NaN
                               NaN
                                     NaN
4
      {\tt NaN}
            {\tt NaN}
                  NaN
                         NaN
                               NaN
                                     NaN
. .
             •••
312
      NaN
            NaN
                  NaN
                         NaN
                               NaN
                                      NaN
313
     {\tt NaN}
            NaN
                  NaN
                         NaN
                               NaN
                                     NaN
314
      {\tt NaN}
                                     NaN
            NaN
                  NaN
                         NaN
                               NaN
315
      NaN
            {\tt NaN}
                  NaN
                         NaN
                               NaN
                                     NaN
316
      NaN
            {\tt NaN}
                  NaN
                         NaN
                               NaN
                                     NaN
[317 rows x 69 columns]
```

b) With a for loop, draw and study the values in each of the remaining W columns.

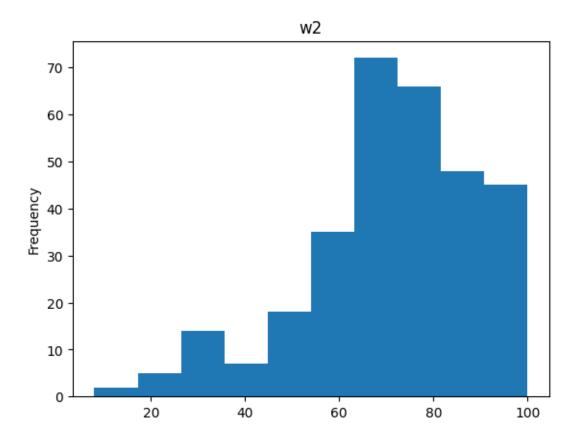
```
[22]: import matplotlib.pyplot as plt

for col in billboard_df.columns[billboard_df.columns.str.startswith('w')]:
    print(f"\n--- Column: {col} ---")
    print(billboard_df[col].describe())
    billboard_df[col].plot.hist(title=col)
    plt.show()
```

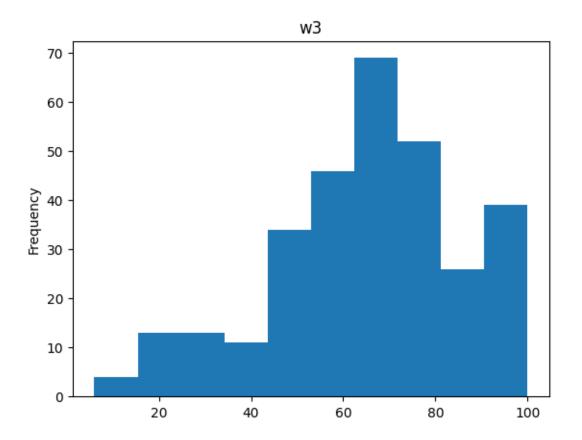
```
--- Column: w1 ---
         317.000000
count
          79.958991
mean
std
          14.686865
          15.000000
min
25%
          74.000000
50%
          81.000000
          91.000000
75%
         100.000000
max
Name: w1, dtype: float64
```



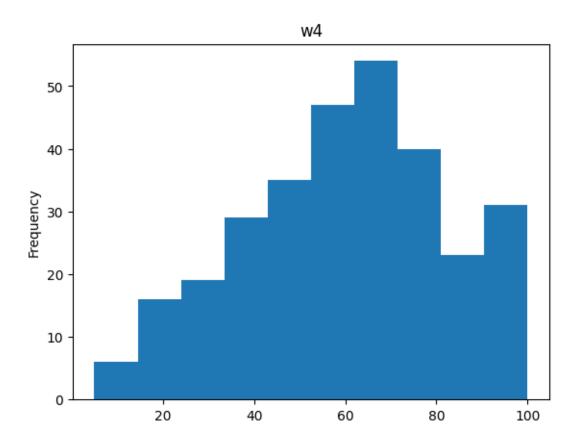
Colu	ımn: w2
count	312.000000
mean	71.173077
std	18.200443
min	8.000000
25%	63.000000
50%	73.000000
75%	84.000000
max	100.000000
Name: w	dtype: float64



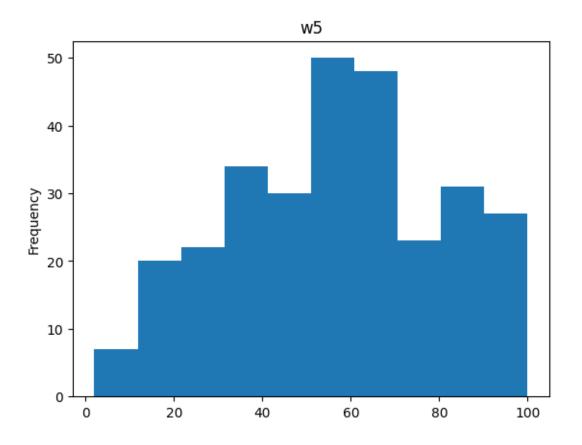
Co	olumn: w3
count	307.000000
mean	65.045603
std	20.752302
min	6.000000
25%	53.000000
50%	66.000000
75%	79.000000
max	100.000000
Name:	w3. dtvpe: float64



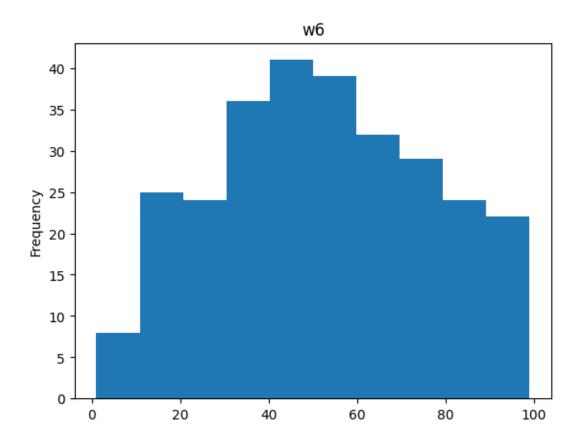
Co	olumn: w4
count	300.000000
mean	59.763333
std	22.324619
min	5.000000
25%	44.750000
50%	61.000000
75%	76.000000
max	100.000000
Name:	w4. dtype: float64



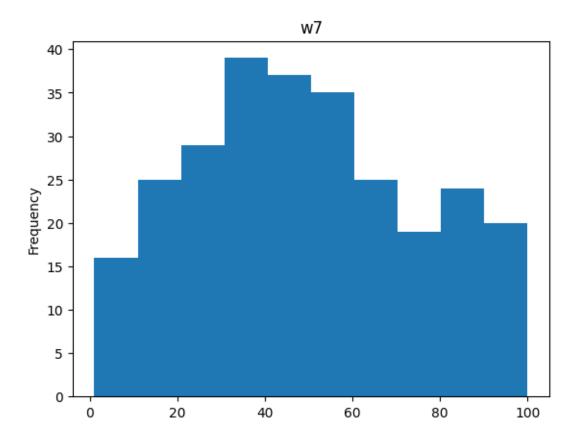
Co	olumn: w5
${\tt count}$	292.000000
mean	56.339041
std	23.780022
min	2.000000
25%	38.750000
50%	57.000000
75%	73.250000
max	100.000000
Name:	w5 dtype: float64



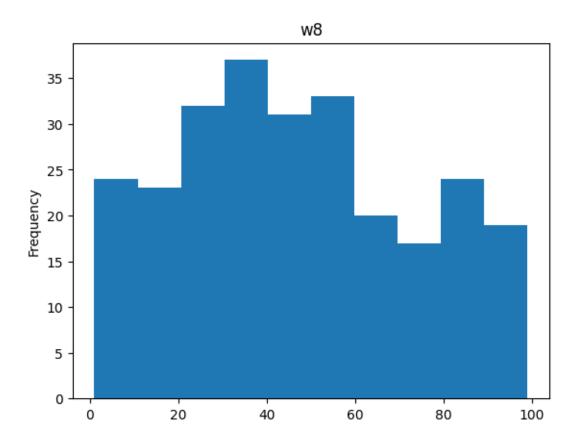
Co	olumr	n: w6 -	
count	2	280.000	000
mean		52.360	714
std		24.473	273
min		1.0000	000
25%		33.750	000
50%		51.5000	000
75%		72.2500	000
max		99.000	000
Name:	w6.	dtvpe:	float64



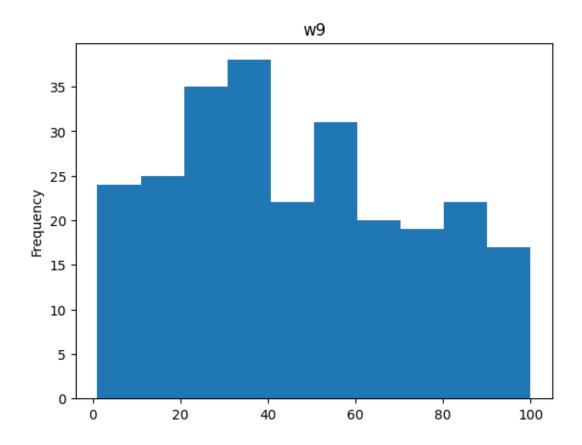
Co	olumn: w7
count	269.000000
mean	49.219331
std	25.654279
min	1.000000
25%	30.000000
50%	47.000000
75%	67.000000
max	100.000000
Name:	w7, dtype: float64



Co	olumi	n: w8 -	
count	2	260.000	000
mean		47.1192	231
std		26.370	782
min		1.0000	000
25%		27.0000	000
50%		45.5000	000
75%		67.0000	000
max		99.000	000
Name:	w8,	dtype:	float64

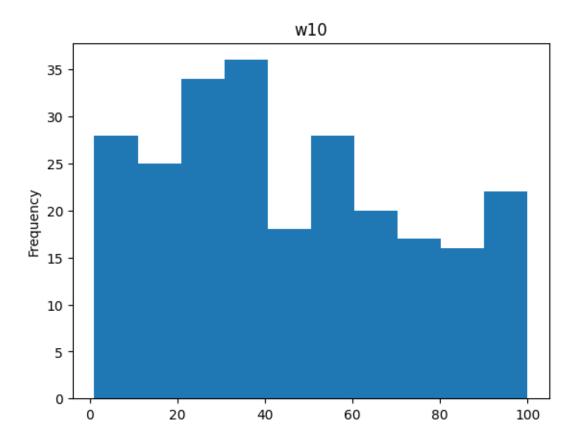


Co	olumn: w9
count	253.000000
mean	46.343874
std	27.136419
min	1.000000
25%	26.000000
50%	42.000000
75%	67.000000
max	100.000000
Name:	w9. dtvpe: float64



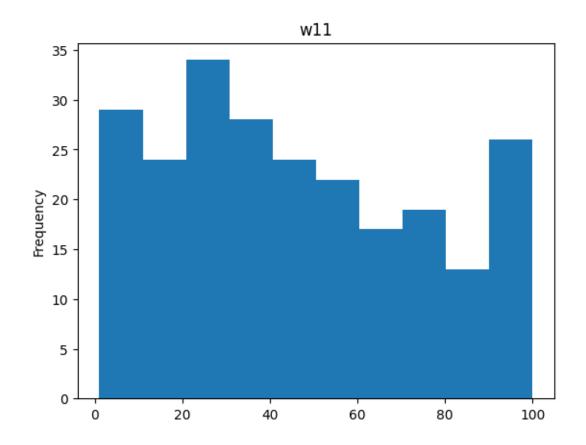
--- Column: w10 ---244.000000 count mean 45.786885 28.152357 std 1.000000 min 24.750000 25% 40.000000 50% 75% 69.000000 100.000000  ${\tt max}$ 

Name: w10, dtype: float64



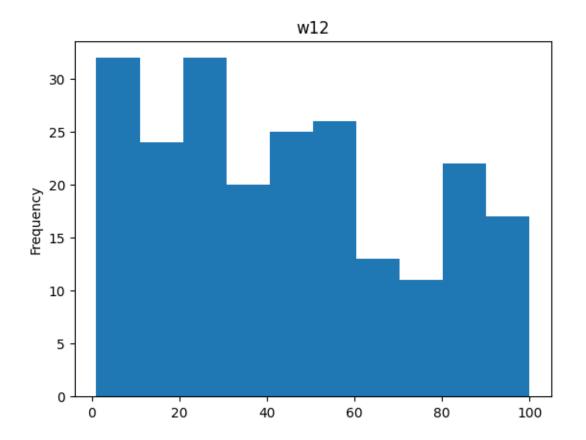
Cd	olumn: w11
count	236.000000
mean	45.474576
std	29.060527
min	1.000000
25%	22.000000
50%	42.500000
75%	69.250000
max	100.000000
Nomo:	111 d+1100 floot

Name: w11, dtype: float64



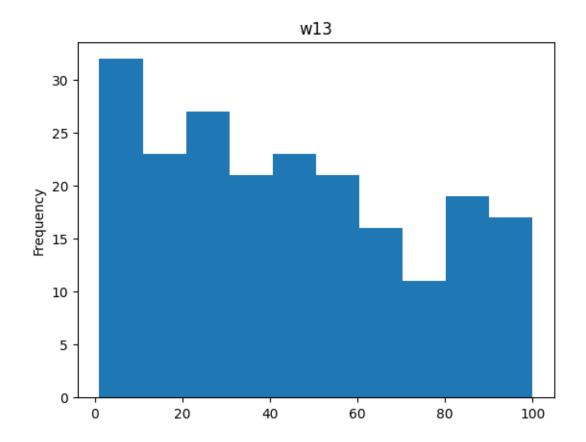
Colum	mn: w12
count	222.000000
mean	44.198198
std	28.893100
min	1.000000
25%	20.250000
50%	42.000000
75%	67.750000
max	100.000000

Name: w12, dtype: float64

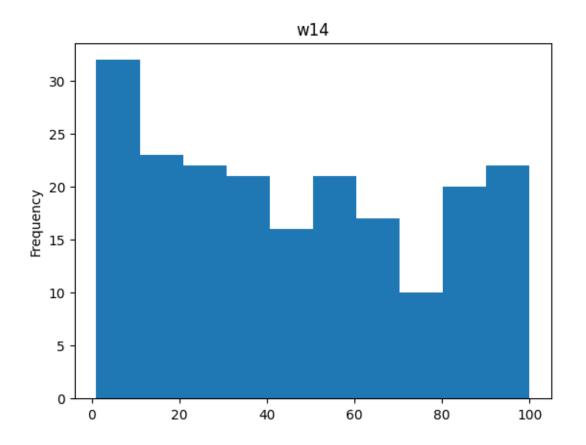


--- Column: w13 ---210.000000 count mean 44.352381 29.481315 std 1.000000 min 25% 19.000000 50% 42.500000 75% 68.750000 100.000000  ${\tt max}$ 

Name: w13, dtype: float64

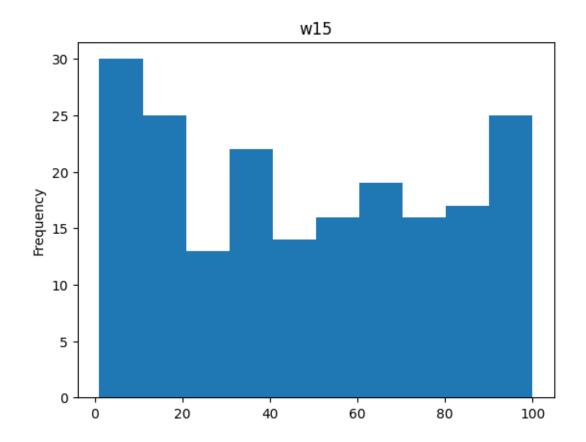


Name: w14, dtype: float64



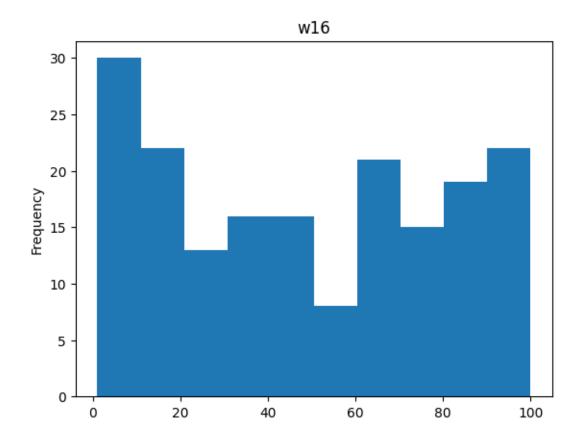
Colum	nn: w15
count	197.000000
mean	47.898477
std	31.542486
min	1.000000
25%	18.000000
50%	46.000000
75%	76.000000
max	100.000000

Name: w15, dtype: float64



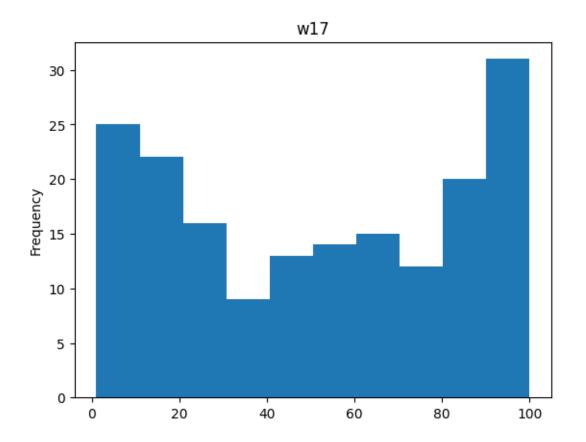
Colum	n: w16
count	182.000000
mean	48.241758
std	31.899476
min	1.000000
25%	17.000000
50%	47.000000
75%	76.000000
max	100.000000

Name: w16, dtype: float64



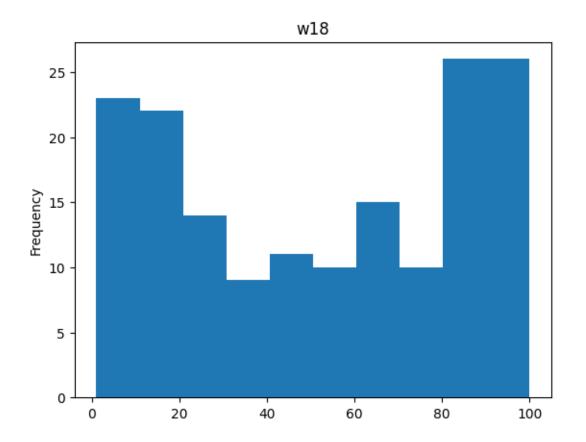
C	olumn: w17
count	177.000000
mean	51.265537
std	33.093233
min	1.000000
25%	19.000000
50%	52.000000
75%	85.000000
max	100.000000
Nomo.	17 d+

Name: w17, dtype: float64



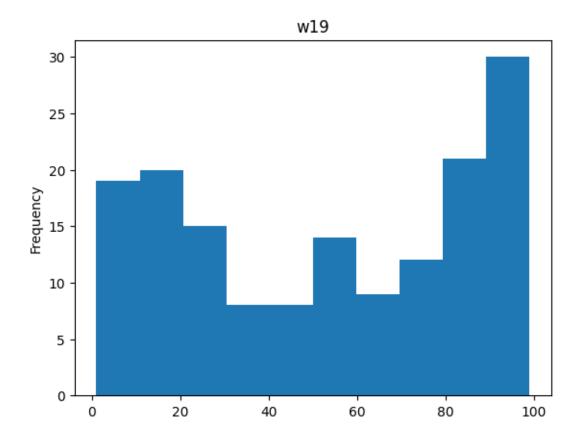
Column: w18
t 166.000000
52.108434
33.194199
1.000000
19.000000
56.500000
84.000000
100.000000

Name: w18, dtype: float64

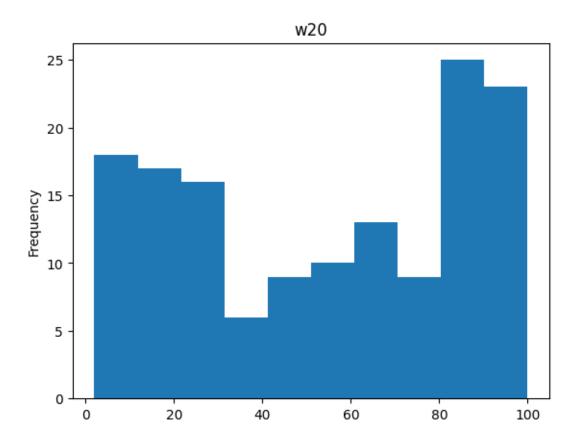


Co	olumn:	w19 -	
count	156	5.0000	00
mean	53	3.1666	67
std	33	3.0225	40
min	1	.0000	00
25%	20	75000	00
50%	55	5.5000	00
75%	85	5.0000	00
max	99	00000	00
Nama:	TT10	1+1100.	floa+6

Name: w19, dtype: float64

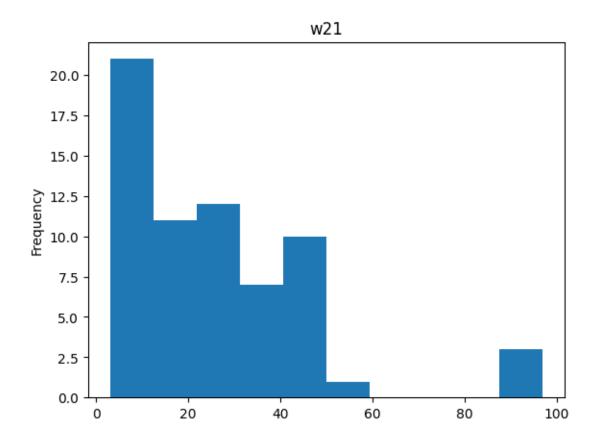


C	olumn: w20
count	146.000000
mean	54.267123
std	32.890475
min	2.000000
25%	22.250000
50%	58.500000
75%	87.000000
max	100.000000
Name:	w20, dtype: float64



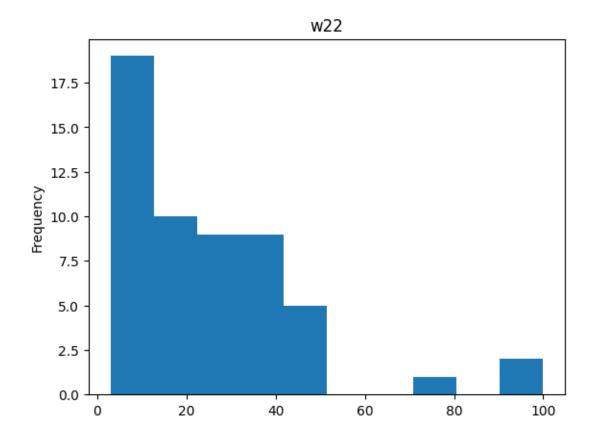
--- Column: w21 --count 65.000000 mean 26.184615 20.232162 std 3.000000 min 25% 10.000000 24.000000 50% 75% 35.000000 97.000000  ${\tt max}$ 

Name: w21, dtype: float64



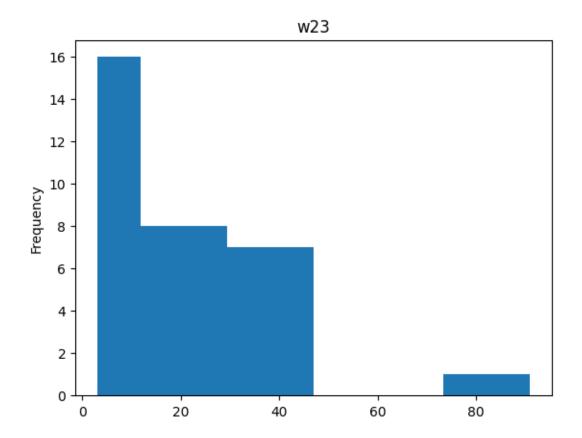
Co	olumn: w22
count	55.000000
mean	25.636364
std	21.127798
min	3.000000
25%	9.000000
50%	21.000000
75%	36.500000
max	100.000000
NT	00 47-

Name: w22, dtype: float64



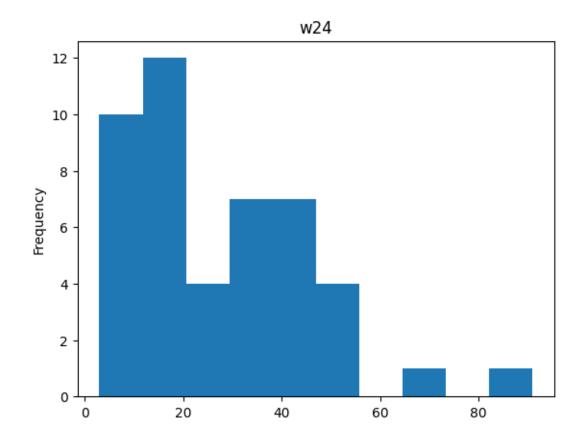
--- Column: w23 --count 48.00000 mean 23.81250 18.23564 std 3.00000 min 25% 10.00000 20.50000 50% 75% 36.00000 91.00000  ${\tt max}$ 

Name: w23, dtype: float64



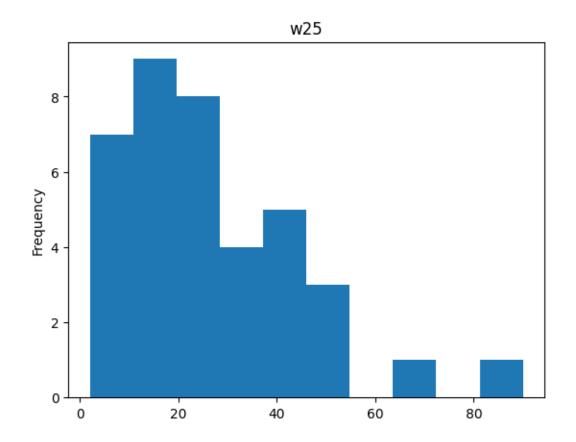
--- Column: w24 --count 46.000000 mean 26.782609 18.556716 std 3.000000 min 25% 12.000000 50% 21.500000 75% 40.500000 91.000000  ${\tt max}$ 

Name: w24, dtype: float64



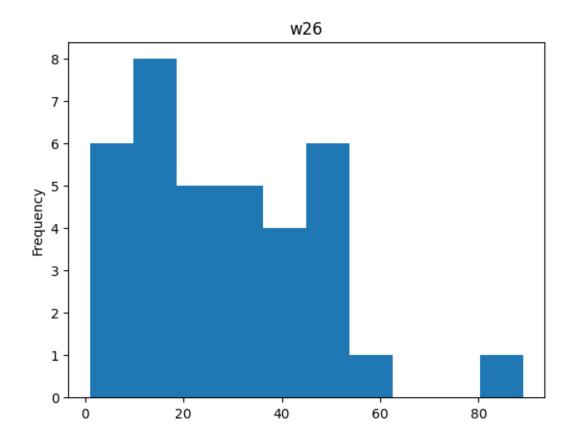
--- Column: w25 --count 38.000000 mean 26.131579 18.737404 std 2.000000 min 25% 12.250000 50% 22.500000 75% 38.250000 90.000000  ${\tt max}$ 

Name: w25, dtype: float64



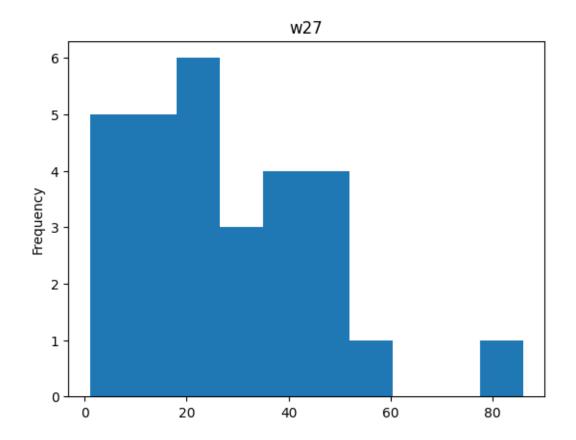
	Column:	w26	
coun	t 36	.0000	00
mean	28	.0000	00
std	19	.1490	)4
min	1	.0000	00
25%	13	.7500	00
50%	26	.0000	00
75%	40	.2500	00
max	89	.0000	00

Name: w26, dtype: float64



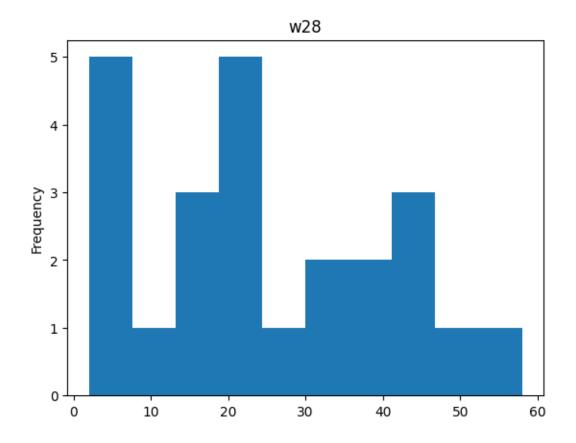
Colu	mn: w27
count	29.000000
mean	27.344828
std	19.736254
min	1.000000
25%	12.000000
50%	26.000000
75%	38.000000
max	86.000000

Name: w27, dtype: float64



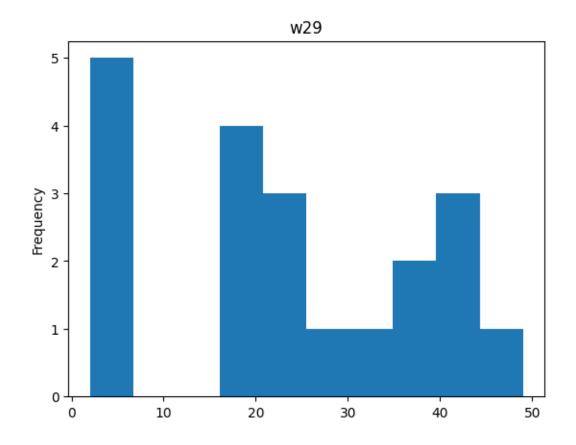
C	olumn: w28
count	24.000000
mean	25.000000
std	16.229335
min	2.000000
25%	14.500000
50%	23.500000
75%	37.500000
max	58.000000

Name: w28, dtype: float64



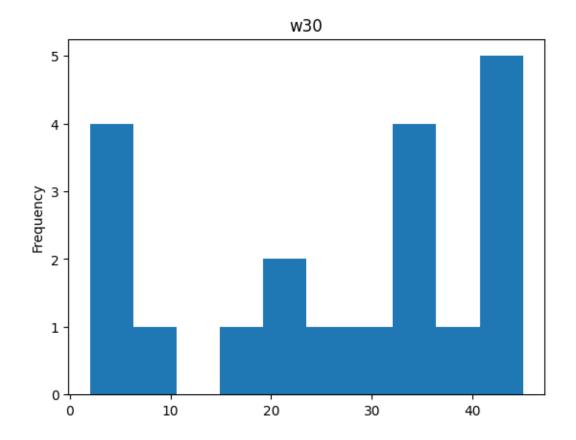
	Column:	w29	
cour	nt 20	.0000	000
mear	n 23	.6500	000
$\operatorname{\mathtt{std}}$	15	.2394	105
min	2	.0000	000
25%	13	.7500	000
50%	22	.5000	000
75%	36	.0000	000
$\max$	49	.0000	000

Name: w29, dtype: float64



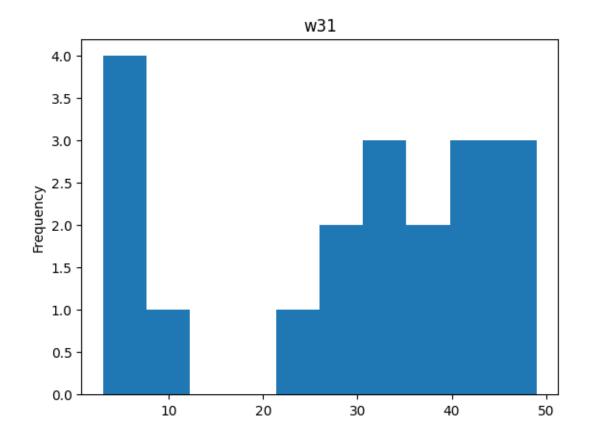
--- Column: w30 --count 20.000000 mean 26.400000 15.104548 std 2.000000 min 25% 16.000000 31.500000 50% 75% 38.000000 45.000000  ${\tt max}$ 

Name: w30, dtype: float64



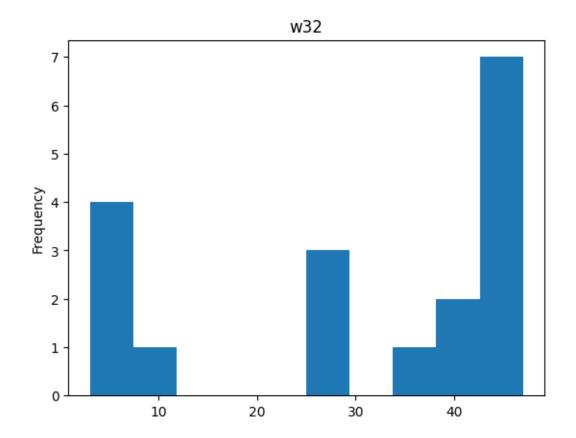
--- Column: w31 --count 19.000000 mean 28.736842 16.002924 std 3.000000  ${\tt min}$ 25% 16.000000 34.000000 50% 75% 41.000000 49.000000  ${\tt max}$ 

Name: w31, dtype: float64



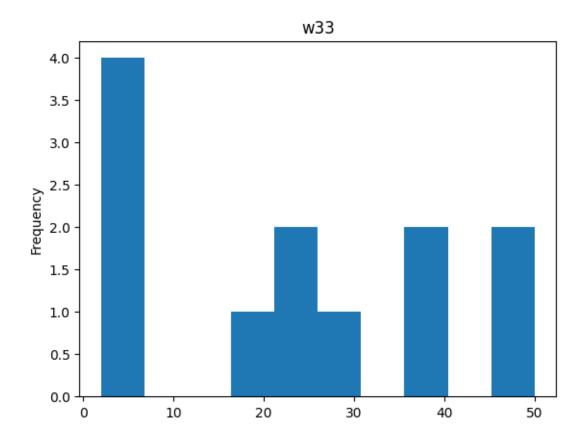
--- Column: w32 --count 18.000000 mean 30.277778 17.032169 std 3.000000  ${\tt min}$ 25% 14.500000 38.000000 50% 75% 44.000000 47.000000  ${\tt max}$ 

Name: w32, dtype: float64



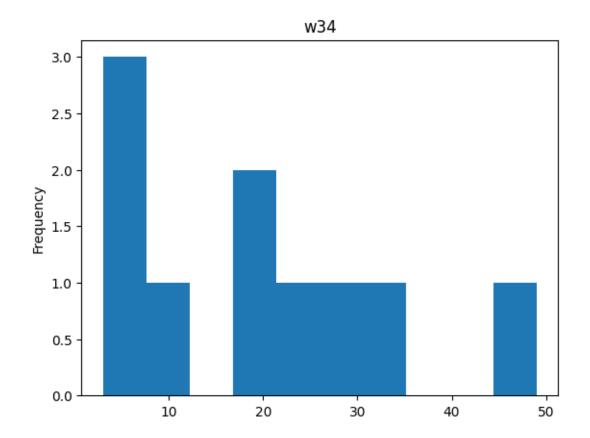
Co	lumn: w33
count	12.000000
mean	23.166667
std	17.071152
min	2.000000
25%	5.500000
50%	24.000000
75%	36.250000
max	50.000000

Name: w33, dtype: float64



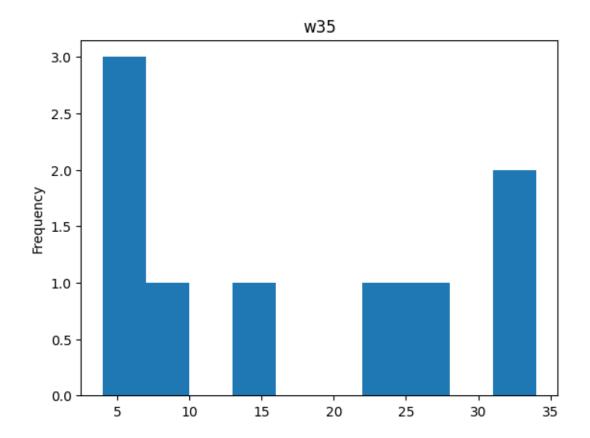
--- Column: w34 --count 10.000000 mean 19.300000 14.929836 std 3.000000  ${\tt min}$ 25% 5.750000 50% 18.500000 75% 28.250000 49.000000  ${\tt max}$ 

Name: w34, dtype: float64



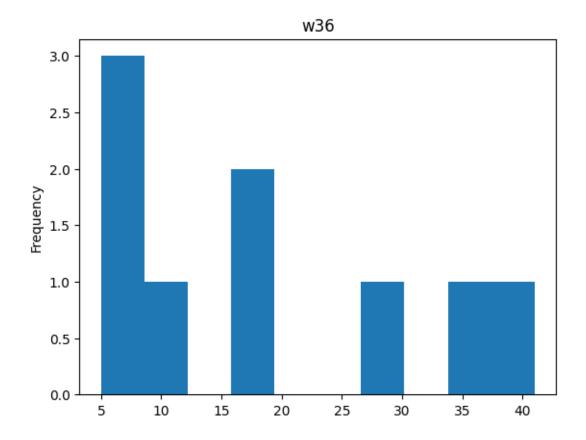
--- Column: w35 ---9.000000 count mean 16.888889 std 12.333333 4.000000  ${\tt min}$ 25% 5.000000 14.000000 50% 75% 27.000000 34.000000  ${\tt max}$ 

Name: w35, dtype: float64



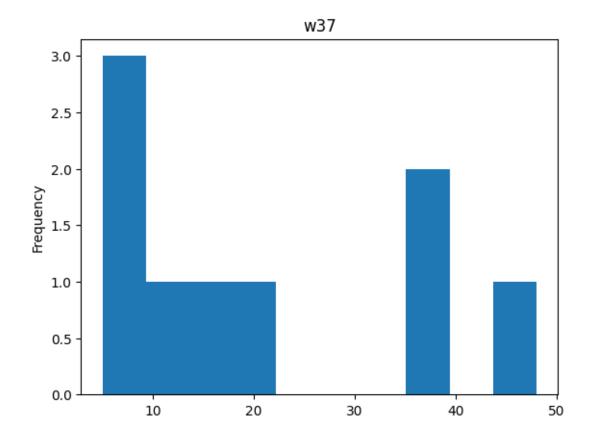
--- Column: w36 ---9.000000 count mean 18.555556 std 13.893444 5.000000  ${\tt min}$ 25% 6.000000 16.000000 50% 75% 29.000000 41.000000  ${\tt max}$ 

Name: w36, dtype: float64



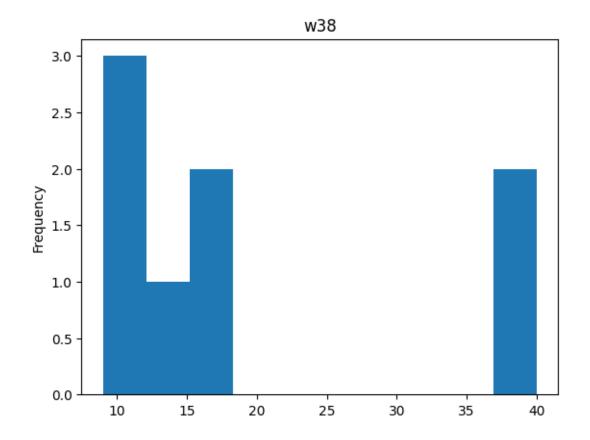
--- Column: w37 ---9.000000 count mean 20.888889 15.799086 std 5.000000  ${\tt min}$ 25% 9.000000 16.000000 50% 75% 36.000000 48.000000  ${\tt max}$ 

Name: w37, dtype: float64



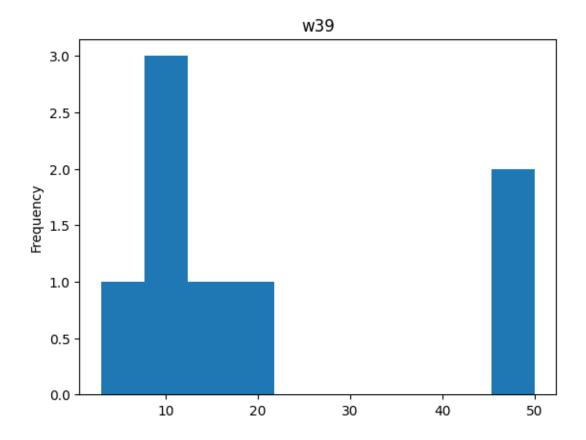
--- Column: w38 ---8.000000 count mean 19.375000 12.693502 std 9.000000  ${\tt min}$ 25% 9.000000 16.000000 50% 75% 23.000000 40.000000  ${\tt max}$ 

Name: w38, dtype: float64



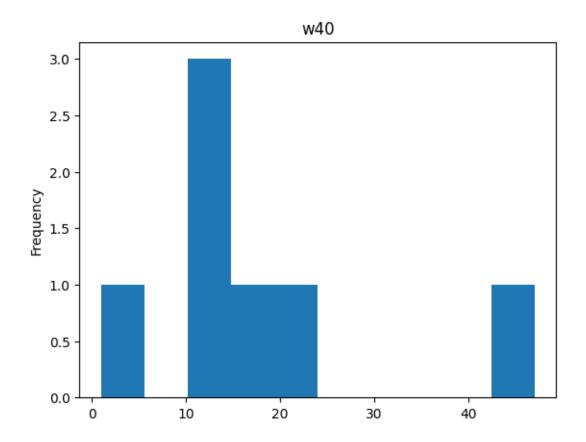
--- Column: w39 ---8.000000 count mean 20.250000 18.289341 std 3.000000  ${\tt min}$ 25% 8.750000 50% 13.000000 75% 25.500000 50.000000  ${\tt max}$ 

Name: w39, dtype: float64



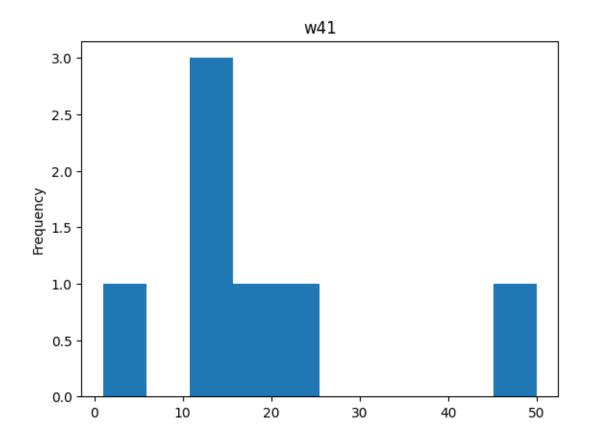
--- Column: w40 --count 7.000000 mean 17.857143 std 14.264508 1.000000  ${\tt min}$ 25% 13.000000 14.000000 50% 75% 18.500000 47.000000  ${\tt max}$ 

Name: w40, dtype: float64



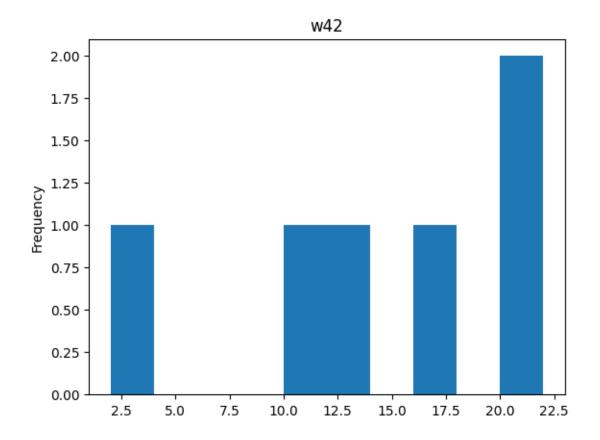
--- Column: w41 --count 7.000000 mean 18.571429 15.306395 std 1.000000  ${\tt min}$ 25% 13.000000 14.000000 50% 75% 19.500000 50.000000  ${\tt max}$ 

Name: w41, dtype: float64



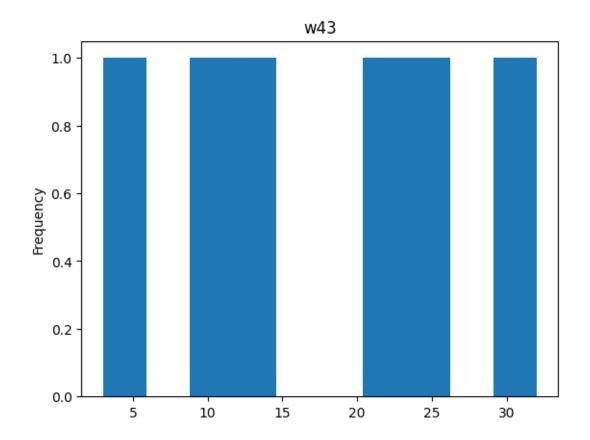
--- Column: w42 ---6.000000 count mean 14.166667 7.250287 std 2.000000  ${\tt min}$ 25% 11.500000 15.000000 50% 75% 19.250000 22.000000  ${\tt max}$ 

Name: w42, dtype: float64



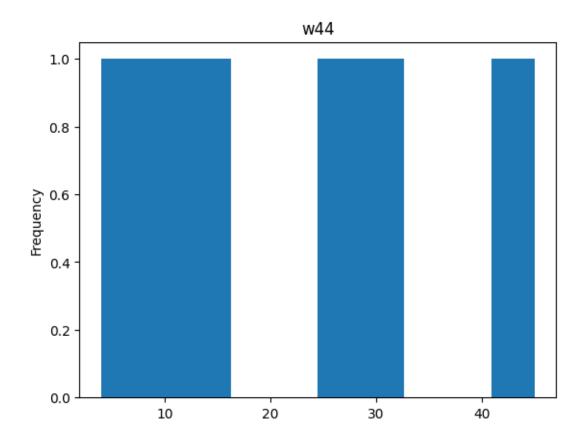
--- Column: w43 --count 6.000000 mean 17.666667 std 10.366613 3.000000 min 25% 11.750000 50% 18.000000 75% 23.500000 32.000000  ${\tt max}$ 

Name: w43, dtype: float64



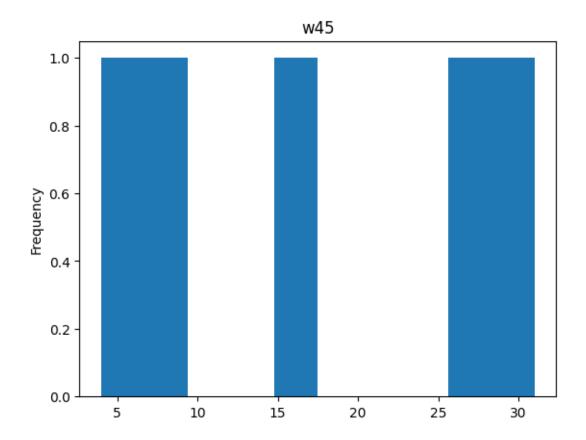
--- Column: w44 ---6.000000 count mean 21.666667 15.081998 std 4.000000  ${\tt min}$ 25% 10.750000 50% 21.000000 75% 29.000000 45.000000  ${\tt max}$ 

Name: w44, dtype: float64



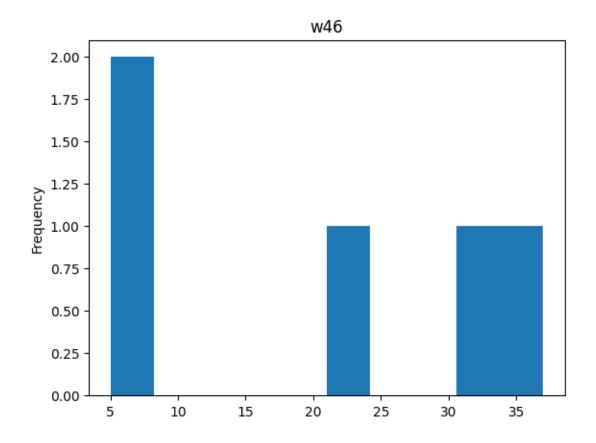
--- Column: w45 ---5.000000 count mean 17.800000 11.691878 std 4.000000  ${\tt min}$ 25% 9.000000 50% 17.000000 75% 28.000000 31.000000  ${\tt max}$ 

Name: w45, dtype: float64



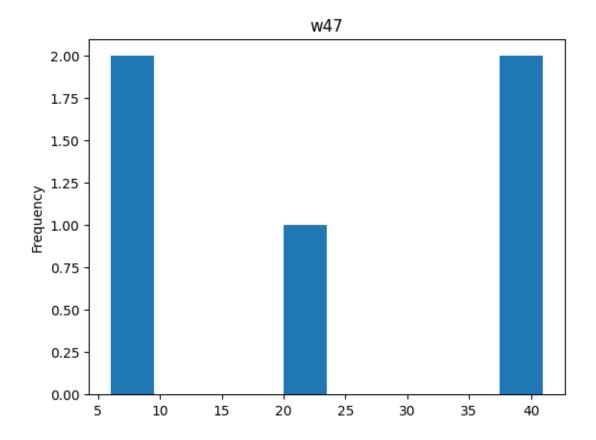
--- Column: w46 ---5.000000 count mean 20.200000 14.184499 std 5.000000  ${\tt min}$ 25% 7.000000 50% 21.000000 75% 31.000000 37.000000  ${\tt max}$ 

Name: w46, dtype: float64



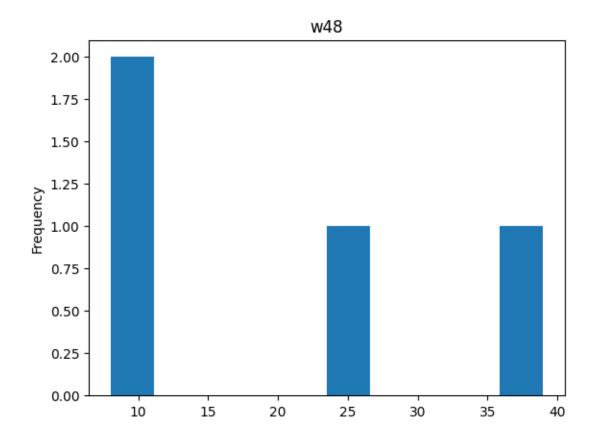
--- Column: w47 --count 5.000000 mean 22.800000 16.543881 std 6.000000  ${\tt min}$ 25% 7.000000 50% 22.000000 75% 38.000000 41.000000 max

Name: w47, dtype: float64



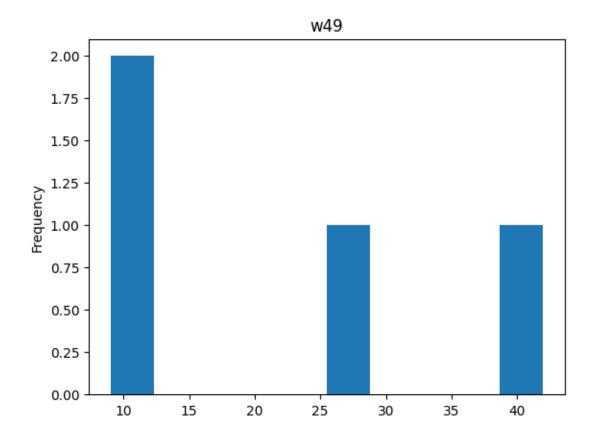
--- Column: w48 --count 4.000000 mean 20.000000 14.628739 std 8.000000 min 25% 8.750000 50% 16.500000 75% 27.750000 39.000000 max

Name: w48, dtype: float64



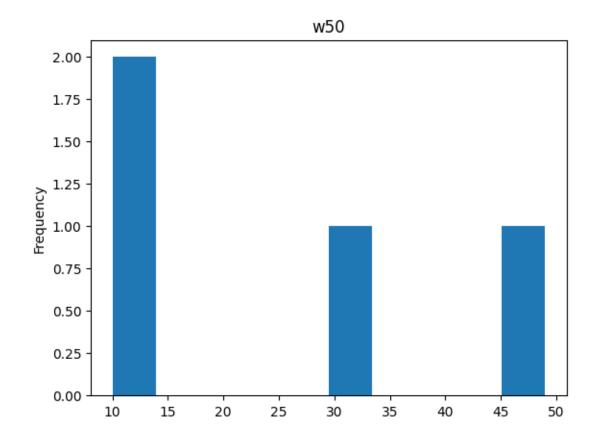
--- Column: w49 --count 4.000000 mean 22.000000 16.062378 std 9.000000 min 25% 9.000000 50% 18.500000 75% 31.500000 42.000000 max

Name: w49, dtype: float64



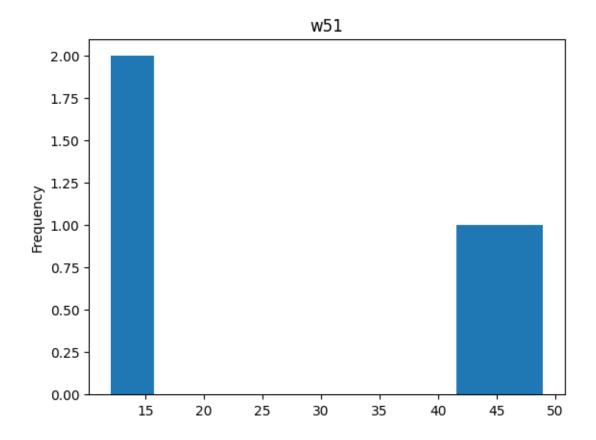
--- Column: w50 --count 4.000000 mean 26.000000 18.529256 std 10.000000 min 25% 11.500000 50% 22.500000 75% 37.000000 49.000000 max

Name: w50, dtype: float64



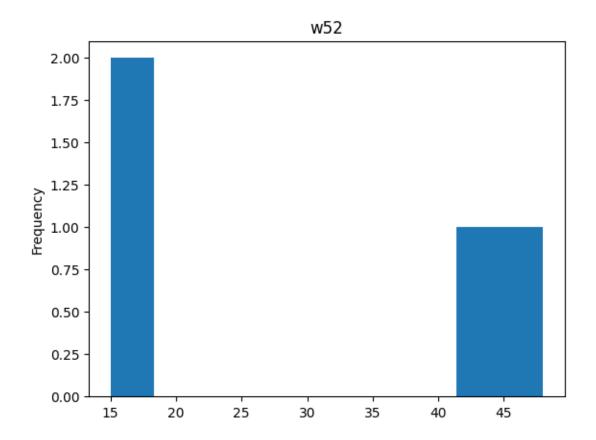
--- Column: w51 --count 4.000000 mean 29.250000 18.997807 std 12.000000 min 25% 13.500000 50% 28.000000 75% 43.750000 49.000000 max

Name: w51, dtype: float64



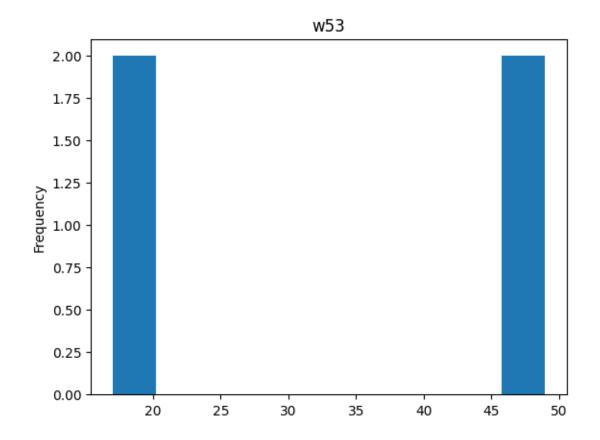
--- Column: w52 --count 4.000000 mean 30.250000 17.211914 std 15.000000 min 25% 15.750000 50% 29.000000 75% 43.500000 48.000000 max

Name: w52, dtype: float64



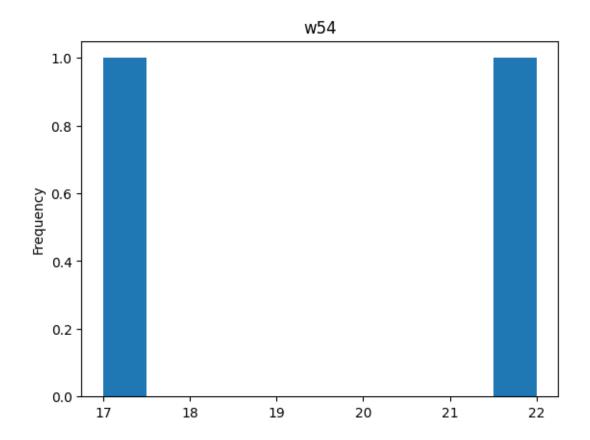
--- Column: w53 --count 4.000000 mean 33.250000 17.095321 std 17.000000 min 25% 19.250000 50% 33.500000 75% 47.500000 49.000000 max

Name: w53, dtype: float64



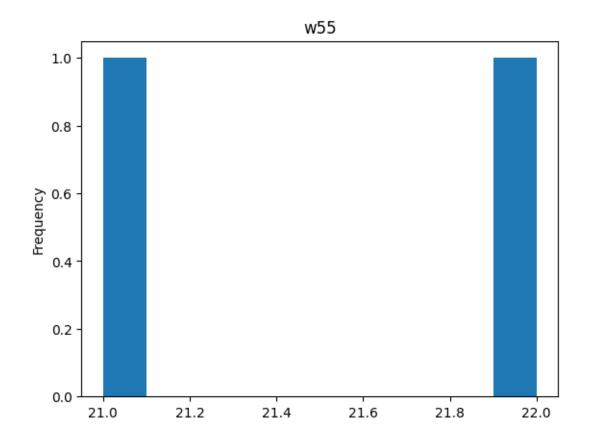
--- Column: w54 --count 2.000000 mean 19.500000 std 3.535534 17.000000 min 25% 18.250000 50% 19.500000 75% 20.750000 22.000000 max

Name: w54, dtype: float64



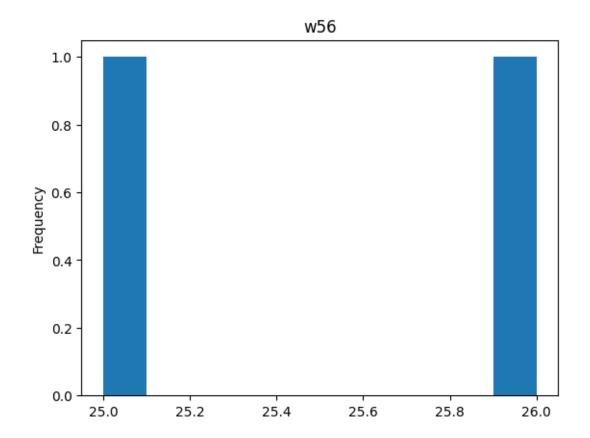
--- Column: w55 ---2.000000 count mean 21.500000 0.707107 std 21.000000  ${\tt min}$ 25% 21.250000 21.500000 50% 75% 21.750000 22.000000  ${\tt max}$ 

Name: w55, dtype: float64



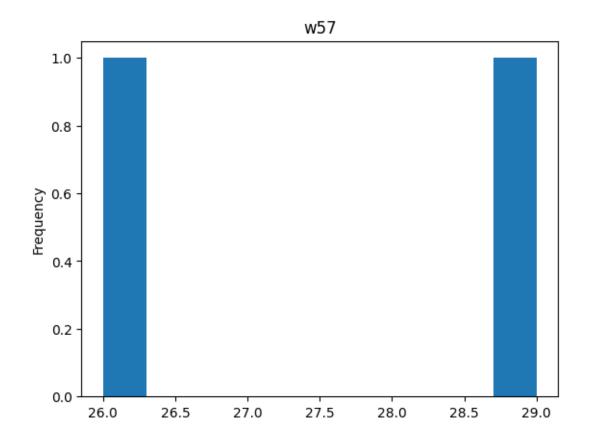
--- Column: w56 --count 2.000000 mean 25.500000 0.707107 std 25.000000 min 25% 25.250000 50% 25.500000 75% 25.750000 26.000000  ${\tt max}$ 

Name: w56, dtype: float64



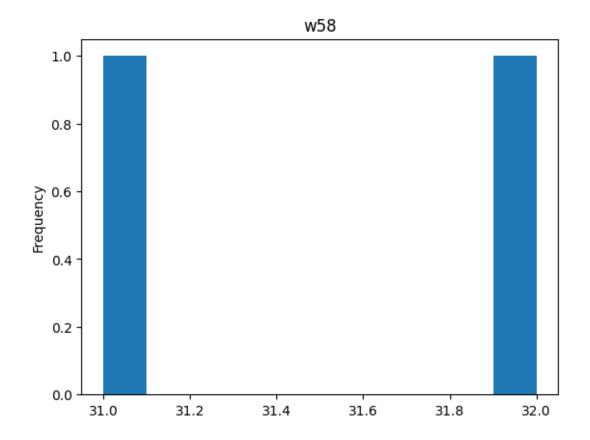
--- Column: w57 --count 2.00000 mean 27.50000 std 2.12132 26.00000 min 25% 26.75000 27.50000 50% 75% 28.25000 29.00000 max

Name: w57, dtype: float64



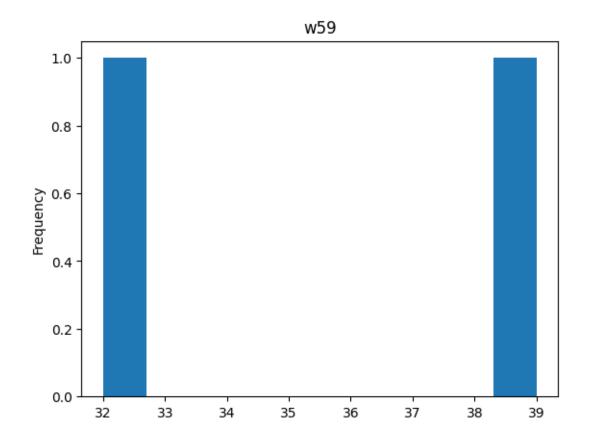
--- Column: w58 --count 2.000000 mean 31.500000 0.707107 std 31.000000 min 25% 31.250000 31.500000 50% 75% 31.750000 32.000000  ${\tt max}$ 

Name: w58, dtype: float64



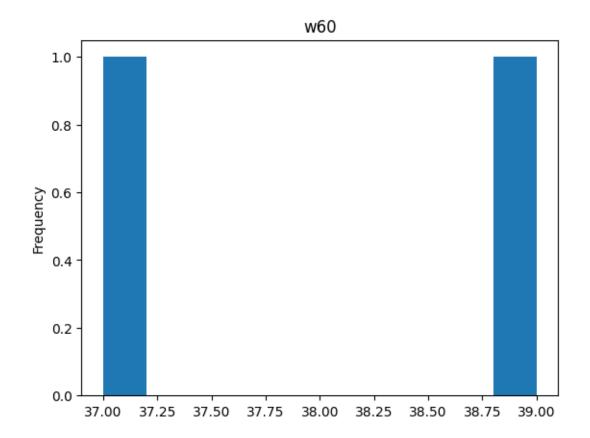
--- Column: w59 --count 2.000000 mean 35.500000 std 4.949747 32.000000 min 25% 33.750000 50% 35.500000 75% 37.250000 39.000000  ${\tt max}$ 

Name: w59, dtype: float64



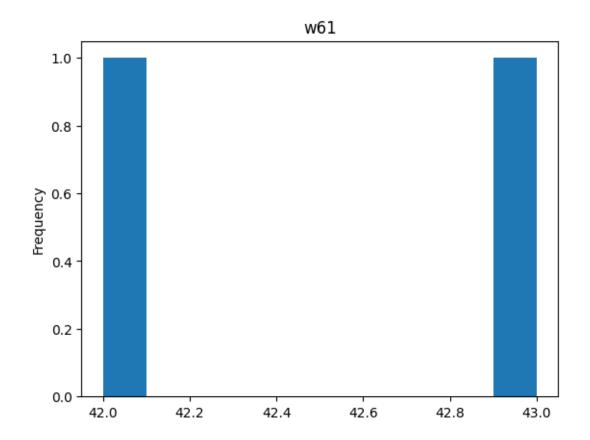
--- Column: w60 ---2.000000 count mean 38.000000 1.414214 std 37.000000 min 25% 37.500000 50% 38.000000 75% 38.500000 39.000000  ${\tt max}$ 

Name: w60, dtype: float64



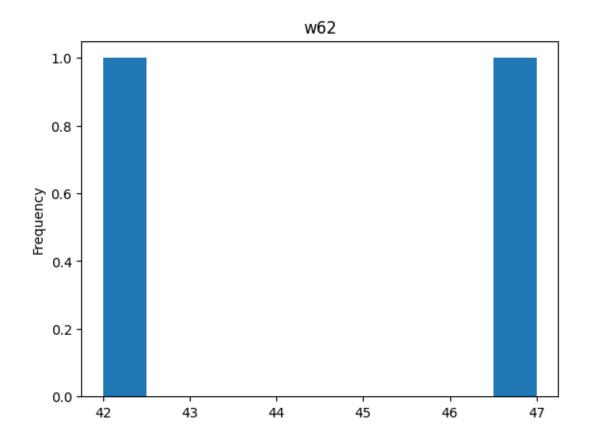
--- Column: w61 --count 2.000000 mean 42.500000 0.707107 std 42.000000 min 25% 42.250000 50% 42.500000 75% 42.750000 43.000000 max

Name: w61, dtype: float64



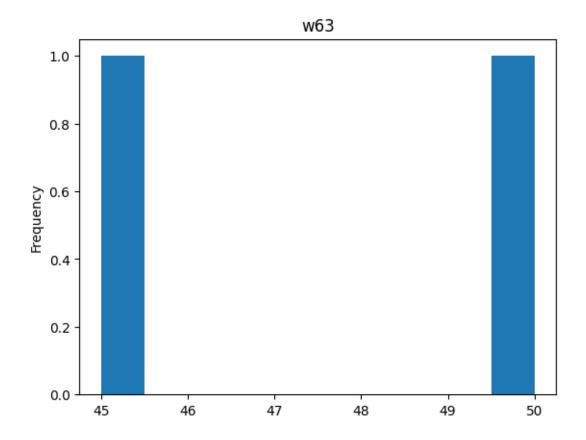
--- Column: w62 ---2.000000 count mean 44.500000 std 3.535534 42.000000 min 25% 43.250000 44.500000 50% 75% 45.750000 47.000000  ${\tt max}$ 

Name: w62, dtype: float64



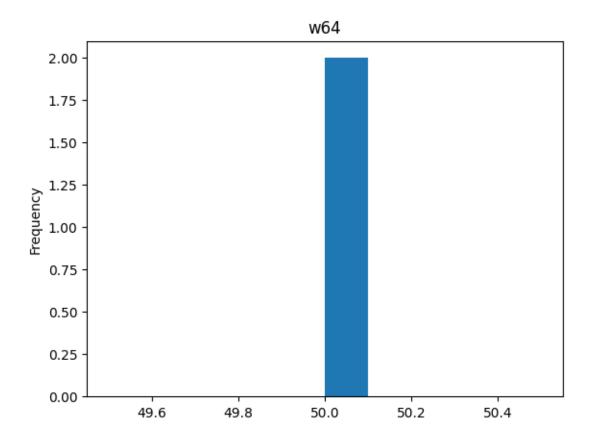
--- Column: w63 ---2.000000 count mean 47.500000 3.535534 std min 45.000000 46.250000 25% 50% 47.500000 75% 48.750000 50.000000  ${\tt max}$ 

Name: w63, dtype: float64



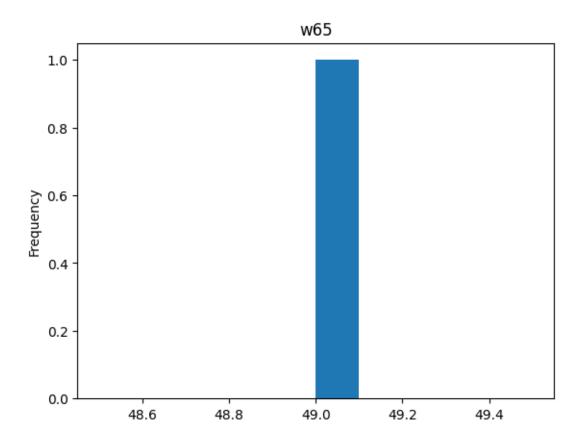
--- Column: w64 --count 2.0 mean 50.0 std 0.0 50.0  ${\tt min}$ 25% 50.0 50% 50.0 50.0 75% 50.0 max

Name: w64, dtype: float64



--- Column: w65 --count 1.0 mean 49.0 NaN std 49.0  $\min$ 49.0 25% 49.0 50% 49.0 75% 49.0 max

Name: w65, dtype: float64



c) The dataset is in wide format, use an appropriate function to switch to a long fromat, and

```
[26]: mlt_df = billboard_df.melt(
    id_vars=["artist", "track", "time", "date_e"],
    value_vars=billboard_df.columns[billboard_df.columns.str.startswith('w')],
    var_name='W',
    value_name='Value'
)
mlt_df
```

```
[26]:
                           artist
                                                                     track time
                 Destiny's Child
      0
                                                 Independent Women Part I
                                                                            3:38
      1
                          Santana
                                                             Maria, Maria
                                                                            4:18
      2
                   Savage Garden
                                                       I Knew I Loved You
                                                                            4:07
      3
                          Madonna
                                                                     Music
                                                                            3:45
      4
             Aguilera, Christina
                                   Come On Over Baby (All I Want Is You)
                                                                            3:38
      20600
                Ghostface Killah
                                                         Cherchez LaGhost
                                                                            3:04
      20601
                      Smith, Will
                                                              Freakin' It
                                                                            3:58
      20602
                   Zombie Nation
                                                            Kernkraft 400
                                                                            3:30
      20603
                   Eastsidaz, The
                                                                  Got Beef
                                                                            3:58
```

```
20604
                           Fragma
                                                            Toca's Miracle 3:22
                  date_e
                               Value
      0
             2000-09-23
                           w1
                                 78.0
      1
             2000-02-12
                                 15.0
                           w1
      2
             1999-10-23
                                71.0
                           w1
      3
                                41.0
             2000-08-12
                           w1
      4
                           w1
             2000-08-05
                                 57.0
      20600
             2000-08-05
                          w65
                                  NaN
                                  NaN
      20601
             2000-02-12
                          w65
      20602
             2000-09-02
                          w65
                                  NaN
      20603
             2000-07-01
                          w65
                                  NaN
      20604
             2000-10-28
                          w65
                                  NaN
      [20605 rows x 6 columns]
     d) Write a code that shows mlt_df's every 1200 rows.
[27]: mlt_df[0:20605:1200]
[27]:
                        artist
                                                                track
                                                                       time
                                                                                  date_e
              Destiny's Child
                                           Independent Women Part I
                                                                       3:38
                                                                             2000-09-23
      1200
                   Limp Bizkit
                                                      N 2 Gether Now
                                                                       3:55
                                                                             1999-12-04
      2400
                  Urban, Keith
                                                     Your Everything
                                                                       4:10
                                                                             2000-07-15
                                              Shackles (Praise You)
      3600
                     Mary Mary
                                                                       3:12
                                                                             2000-03-25
      4800
                          Pink
                                                          There U Go
                                                                       3:23
                                                                             2000-03-04
      6000
               Levert, Gerald
                                                          Baby U Are
                                                                       4:10
                                                                             2000-08-19
                         Jay-Z
      7200
                                      Do It Again (Put Ya Hands Up)
                                                                       3:47
                                                                             2000-01-15
                 Tippin, Aaron
      8400
                                                           Kiss This
                                                                       2:53
                                                                             2000-08-26
      9600
                  Rimes, LeAnn
                                                            Big Deal
                                                                       3:03
                                                                             1999-10-16
      10800
                           98 i
                                Give Me Just One Night (Una Noche)
                                                                       3:24
                                                                             2000-08-19
      12000
              Estefan, Gloria
                                              No Me Dejes De Querer
                                                                       3:25
                                                                             2000-06-10
                                              It's Always Somethin'
                   Diffie, Joe
      13200
                                                                       2:55
                                                                             2000-08-12
      14400
                       Aaliyah
                                                       I Don't Wanna
                                                                       4:15
                                                                             2000-01-29
             Barenaked Ladies
                                                            Pinch Me
                                                                       3:46
      15600
                                                                             2000-09-09
      16800
                        Fragma
                                                      Toca's Miracle
                                                                       3:22
                                                                             2000-10-28
      18000
                         Drama
                                                   Left, Right, Left
                                                                       3:37
                                                                             2000-02-12
      19200
              Lopez, Jennifer
                                                        Feelin' Good
                                                                       4:28
                                                                             2000-02-19
      20400
               Counting Crows
                                                        Hanginaround
                                                                       4:07
                                                                             1999-11-06
```

Value W 0 w1 78.0 1200 78.0 w4 w8 2400 59.0 3600 w12 39.0 4800 w16 14.0 6000 w19 NaN

```
7200
       w23
               NaN
8400
       w27
               NaN
9600
       w31
               NaN
10800
       w35
               NaN
12000
       w38
               NaN
13200
       w42
               NaN
14400
       w46
               NaN
15600
       w50
               NaN
16800
       w53
               NaN
18000
       w57
               NaN
19200
       w61
               NaN
20400
       w65
               NaN
```

e) Run the following code first and answer the question. Could you have done this by using Bo

```
mlt df.query('artist == "Spears, Britney"')
[28]:
                      artist
                                                                              date_e \
                                                             track
                                                                   time
             Spears, Britney
                                           Oops!.. I Did It Again
                                                                          2000-04-22
      51
                                                                    3:30
             Spears, Britney
                               From The Bottom Of My Broken Heart
      63
                                                                    4:30
                                                                          2000-01-29
             Spears, Britney
                                                             Lucky
                                                                    3:23
      93
                                                                          2000-08-12
      368
             Spears, Britney
                                           Oops!.. I Did It Again
                                                                    3:30
                                                                          2000-04-22
      380
             Spears, Britney
                               From The Bottom Of My Broken Heart
                                                                    4:30
                                                                          2000-01-29
                               From The Bottom Of My Broken Heart
      20034
             Spears, Britney
                                                                    4:30
                                                                          2000-01-29
             Spears, Britney
      20064
                                                             Lucky
                                                                    3:23
                                                                          2000-08-12
             Spears, Britney
                                           Oops!.. I Did It Again
                                                                    3:30
      20339
                                                                          2000-04-22
             Spears, Britney
                              From The Bottom Of My Broken Heart
      20351
                                                                    4:30
                                                                          2000-01-29
             Spears, Britney
      20381
                                                             Lucky
                                                                    3:23
                                                                          2000-08-12
               W
                  Value
                   67.0
      51
              w1
      63
              w1
                   76.0
      93
              w1
                   61.0
      368
              w2
                   38.0
      380
              w2
                   59.0
      20034
             w64
                    NaN
      20064
             w64
                    NaN
      20339
             w65
                    NaN
      20351
             w65
                    NaN
      20381
             w65
                    NaN
```

[195 rows x 6 columns]

Could have done this by using Boolean masking too?

Answer:

```
[30]: BM = mlt_df.artist == "Spears, Britney"
      mlt_df[BM]
[30]:
                      artist
                                                           track time
                                                                            date_e \
             Spears, Britney
                                          Oops!.. I Did It Again 3:30
                                                                        2000-04-22
      51
             Spears, Britney From The Bottom Of My Broken Heart
      63
                                                                  4:30
                                                                        2000-01-29
             Spears, Britney
      93
                                                           Lucky
                                                                  3:23
                                                                        2000-08-12
             Spears, Britney
                                          Oops!.. I Did It Again
      368
                                                                  3:30
                                                                        2000-04-22
      380
             Spears, Britney From The Bottom Of My Broken Heart
                                                                  4:30
                                                                        2000-01-29
            Spears, Britney From The Bottom Of My Broken Heart
      20034
                                                                  4:30
                                                                        2000-01-29
      20064
            Spears, Britney
                                                           Lucky
                                                                  3:23
                                                                        2000-08-12
            Spears, Britney
      20339
                                          Oops!.. I Did It Again
                                                                  3:30
                                                                        2000-04-22
      20351
            Spears, Britney From The Bottom Of My Broken Heart
                                                                  4:30
                                                                        2000-01-29
      20381
            Spears, Britney
                                                           Lucky
                                                                  3:23
                                                                        2000-08-12
                 Value
                   67.0
      51
             w1
      63
             w1
                   76.0
      93
                   61.0
             w1
      368
             w2
                   38.0
      380
             w2
                   59.0
      20034 w64
                    NaN
      20064 w64
                    NaN
      20339
            w65
                    NaN
      20351 w65
                    NaN
      20381
            w65
                    NaN
      [195 rows x 6 columns]
          Use either the approach in e or the Boolean mask, to extract all the unique songs that Br
[33]: mlt_df[BM].track.unique()
[33]: array(['Oops!.. I Did It Again', 'From The Bottom Of My Broken Heart',
             'Lucky'], dtype=object)
     g) In mlt_df show all of the weeks that the song "Oops!.. I Did It Again" was on the top-100
[44]: BM2 = mlt_df.track == "Oops!.. I Did It Again"
      BM3 = mlt_df.Value <= 100
      print(mlt_df[BM & BM2 & BM3])
      mlt_df[BM & BM2 & BM3].W.unique()
                                                                        W Value
                                             track time
                    artist
                                                              date_e
     51
           Spears, Britney Oops!.. I Did It Again 3:30
                                                          2000-04-22
                                                                       w1
                                                                             67.0
           Spears, Britney Oops!.. I Did It Again 3:30
     368
                                                          2000-04-22
                                                                       w2
                                                                            38.0
           Spears, Britney Oops!.. I Did It Again 3:30
     685
                                                          2000-04-22
                                                                       wЗ
                                                                            26.0
```

```
Spears, Britney
                             Oops!.. I Did It Again
                                                            2000-04-22
                                                                               19.0
     1002
                                                      3:30
                                                                          w4
                             Oops!.. I Did It Again
     1319
           Spears, Britney
                                                      3:30
                                                            2000-04-22
                                                                          w5
                                                                               15.0
     1636
           Spears, Britney
                             Oops!.. I Did It Again
                                                      3:30
                                                            2000-04-22
                                                                               13.0
                                                                          w6
           Spears, Britney
                             Oops!.. I Did It Again
                                                                               12.0
     1953
                                                      3:30
                                                            2000-04-22
                                                                          w7
           Spears, Britney
                             Oops!.. I Did It Again
     2270
                                                      3:30
                                                            2000-04-22
                                                                          w8
                                                                                9.0
     2587
           Spears, Britney
                             Oops!.. I Did It Again
                                                                                9.0
                                                      3:30
                                                            2000-04-22
                                                                          w9
     2904
           Spears, Britney
                             Oops!.. I Did It Again
                                                      3:30
                                                            2000-04-22
                                                                         w10
                                                                               10.0
     3221
           Spears, Britney
                             Oops!.. I Did It Again
                                                      3:30
                                                            2000-04-22
                                                                         w11
                                                                               14.0
           Spears, Britney
                             Oops!.. I Did It Again
                                                                         w12
                                                                               15.0
     3538
                                                      3:30
                                                            2000-04-22
                             Oops!.. I Did It Again
     3855
           Spears, Britney
                                                      3:30
                                                            2000-04-22
                                                                         w13
                                                                               17.0
           Spears, Britney
                             Oops!.. I Did It Again
     4172
                                                      3:30
                                                            2000-04-22
                                                                         w14
                                                                               24.0
           Spears, Britney
                             Oops!.. I Did It Again
                                                            2000-04-22
     4489
                                                      3:30
                                                                         w15
                                                                               35.0
           Spears, Britney
                             Oops!.. I Did It Again
     4806
                                                            2000-04-22
                                                                               49.0
                                                      3:30
                                                                         w16
           Spears, Britney
                             Oops!.. I Did It Again
     5123
                                                      3:30
                                                            2000-04-22
                                                                         w17
                                                                               77.0
                             Oops!.. I Did It Again
     5440
           Spears, Britney
                                                      3:30
                                                            2000-04-22
                                                                         w18
                                                                               85.0
     5757
           Spears, Britney
                             Oops!.. I Did It Again
                                                            2000-04-22
                                                                         w19
                                                                               90.0
                                                      3:30
     6074
           Spears, Britney
                             Oops!.. I Did It Again
                                                      3:30
                                                            2000-04-22
                                                                         w20
                                                                               96.0
[44]: array(['w1', 'w2', 'w3', 'w4', 'w5', 'w6', 'w7', 'w8', 'w9', 'w10', 'w11',
             'w12', 'w13', 'w14', 'w15', 'w16', 'w17', 'w18', 'w19', 'w20'],
            dtype=object)
```

Excercise 4 We will use LaqnData.csv for this exercise. Each row of this dataset shows an hourly measurement recording of one of the five following air pollutants: NO, NO2, NOX, PM10, and PM2.5. The data was collected in a location in Londan for the entirety of year 2017. Read the data using Pandas and perform the following tasks.

```
[48]: import pandas as pd
import matplotlib.pyplot as plt

air_df = pd.read_csv('LaqnData.csv')
air_df
```

```
[48]:
             Site Species
                             ReadingDateTime
                                               Value
                                                        Units Provisional or Ratified
      0
              CT3
                            01/01/2017 00:00
                                                  3.5
                                                                                      R
                       NO
                                                       ug m-3
      1
              CT3
                       NO
                            01/01/2017 01:00
                                                  3.6
                                                                                      R
                                                       ug m-3
      2
              CT3
                                                  2.2
                                                                                      R
                       NO
                            01/01/2017 02:00
                                                       ug m-3
      3
              CT3
                       NO
                            01/01/2017 03:00
                                                  2.1
                                                                                      R
                                                       ug m-3
      4
              CT3
                       NO
                            01/01/2017 04:00
                                                  3.3
                                                       ug m-3
                                                                                      R
      43795
             CT3
                    PM2.5
                            31/12/2017 19:00
                                                 -2.0
                                                       ug m-3
                                                                                      R
      43796
             CT3
                    PM2.5
                            31/12/2017 20:00
                                                  6.0
                                                       ug m-3
                                                                                      R.
             CT3
                                                                                      R
      43797
                    PM2.5
                            31/12/2017 21:00
                                                  5.0
                                                       ug m-3
      43798
             CT3
                    PM2.5
                            31/12/2017 22:00
                                                  5.0
                                                       ug m-3
                                                                                      R
      43799
             CT3
                    PM2.5
                            31/12/2017 23:00
                                                  6.0
                                                       ug m-3
                                                                                      R
```

[43800 rows x 6 columns]

a) The dataset has 6 columns. Three of them, naming 'Site', 'Units', 'Provisional or Ratified'

```
[49]: air_df.drop(columns=['Site','Units','Provisional or Ratified'], inplace=True) air_df
```

```
[49]:
            Species
                     ReadingDateTime Value
                 NO 01/01/2017 00:00
      0
                                         3.5
      1
                 NO 01/01/2017 01:00
                                         3.6
      2
                 NO
                    01/01/2017 02:00
                                         2.2
                    01/01/2017 03:00
      3
                NO
                                         2.1
      4
                 NO 01/01/2017 04:00
                                         3.3
      43795
             PM2.5
                    31/12/2017 19:00
                                        -2.0
             PM2.5 31/12/2017 20:00
                                         6.0
      43796
                                         5.0
      43797
             PM2.5 31/12/2017 21:00
      43798
             PM2.5 31/12/2017 22:00
                                         5.0
      43799
             PM2.5 31/12/2017 23:00
                                         6.0
```

[43800 rows x 3 columns]

b) The dataset is in a long format. Apply the appropriate function to switch it to the wide for

```
[51]: pvt_df = air_df.pivot(
          index="ReadingDateTime",
          columns="Species",
          values="Value"
    )
    pvt_df
```

```
[51]: Species
                        NO
                            NO2
                                  NOX PM10 PM2.5
     ReadingDateTime
     01/01/2017 00:00
                                 36.2
                                       35.7
                       3.5
                           30.8
                                               NaN
     01/01/2017 01:00
                       3.6
                           31.5
                                 37.0
                                       28.5
                                               NaN
     01/01/2017 02:00
                       2.2
                           27.3 30.7
                                       22.7
                                               NaN
                       2.1
                           23.5
     01/01/2017 03:00
                                 26.8
                                       20.5
                                               NaN
     01/01/2017 04:00
                       3.3
                            28.0 33.0
                                       22.1
                                               NaN
                            •••
     31/12/2017 19:00 0.7
                           17.5 18.5 16.3
                                              -2.0
                                               6.0
     31/12/2017 20:00 0.7
                           17.5 18.6
                                       14.5
     31/12/2017 21:00
                      0.7 14.1 15.1
                                               5.0
                                        8.6
     31/12/2017 22:00
                       1.1
                           22.0
                                 23.6 12.5
                                               5.0
     31/12/2017 23:00 0.9 19.4
                                 20.7
                                       10.4
                                               6.0
```

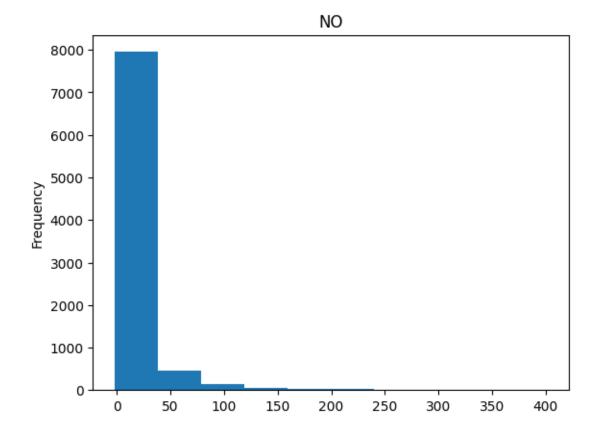
[8760 rows x 5 columns]

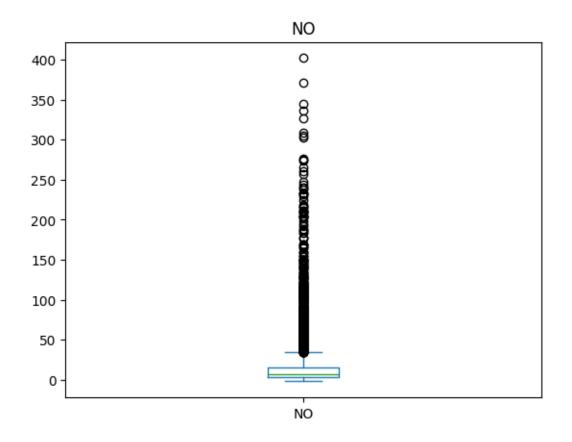
c) Draw and study the histogram and boxplots for columns of pvt\_df.

```
[55]: import matplotlib.pyplot as plt

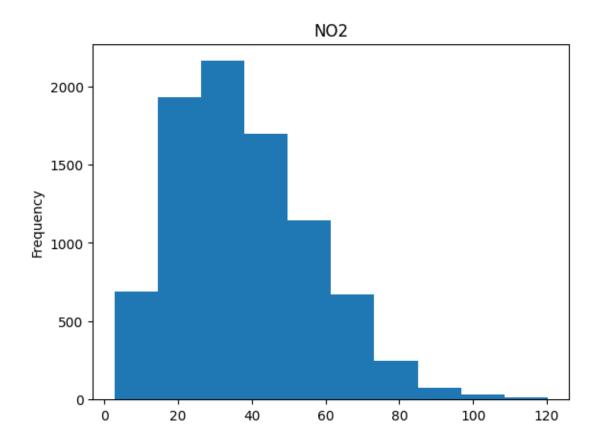
for col in pvt_df:
    print(f"\n--- Column: {col} ----")
    print(pvt_df[col].describe())
    pvt_df[col].plot.hist(title=col)
    plt.show()
    pvt_df[col].plot.box(title=col)
    plt.show()
```

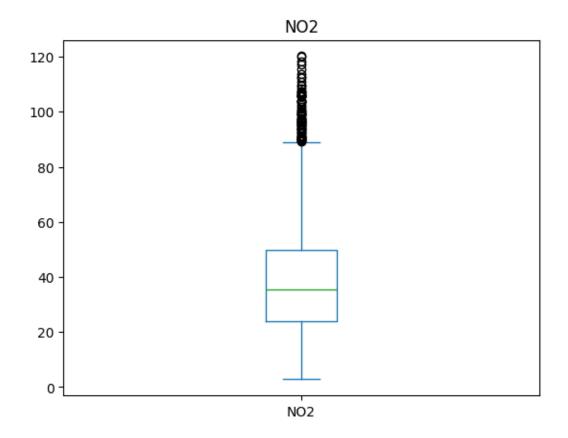
```
--- Column: NO ---
count
         8660.000000
            15.045115
mean
            26.678565
std
            -2.000000
{\tt min}
25%
             3.100000
50%
             7.100000
75%
            15.500000
max
           401.799990
Name: NO, dtype: float64
```



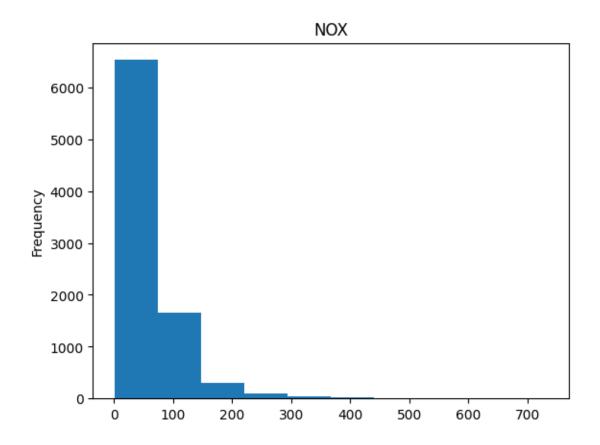


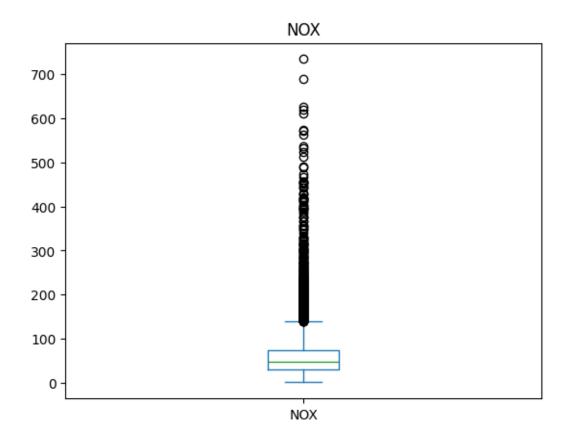
Co	olumn: NO2
${\tt count}$	8660.000000
mean	38.010185
std	18.580841
min	2.800000
25%	23.800000
50%	35.300000
75%	49.900000
max	120.200000
Name:	NO2, dtype: float64





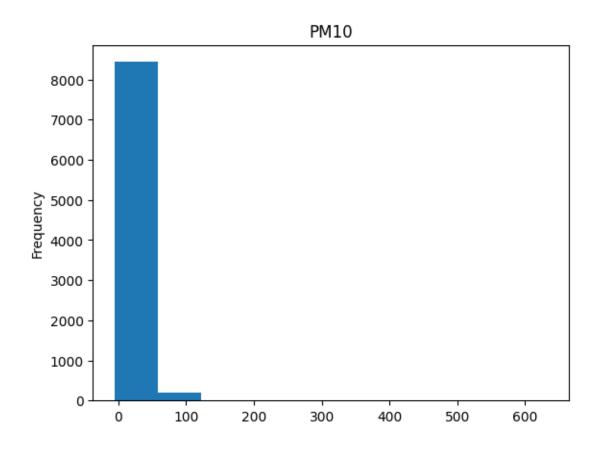
Co	olumn: NOX
count	8660.000000
mean	61.078661
std	54.584805
min	1.000000
25%	30.300000
50%	46.900000
75%	73.800000
max	734.299990
Name:	NOX. dtype: float6

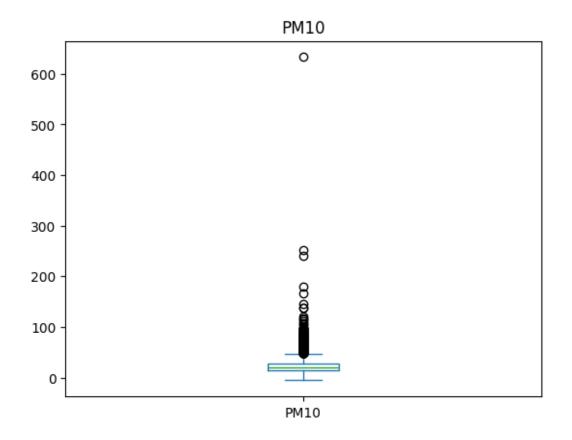




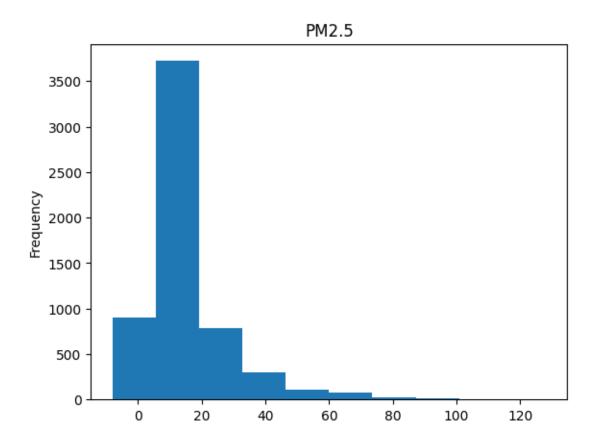
C	olumn: PM10	
count	8657.000000	
mean	22.551704	
std	15.344755	
min	-5.600000	
25%	13.900000	
50%	19.500000	
75%	27.300000	
max	633.099980	
Nama.	DM10 dtyros fl	٦

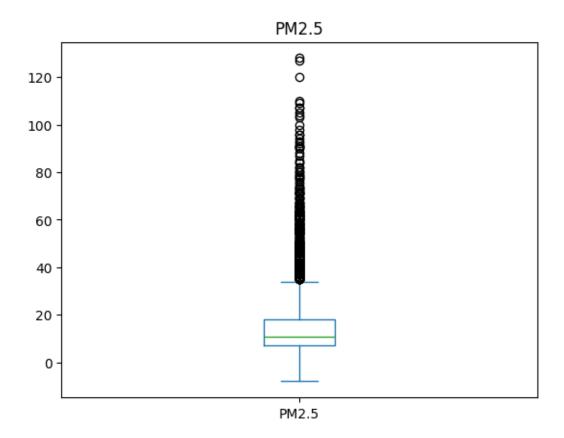
Name: PM10, dtype: float64





Colu	mn: PM2.5
count	5933.000000
mean	14.999831
std	13.558588
min	-8.000000
25%	7.000000
50%	11.000000
75%	18.000000
max	128.000000





**Excercise 5** We will continue working with LaqnData.csv.

a) Run the following code, see its output, and then study the code to answer what each line of

```
import pandas as pd
air_df = pd.read_csv('LaqnData.csv')
air_df.drop(columns=['Site','Units','Provisional or Ratified'], inplace=True)
datetime_df = air_df.ReadingDateTime.str.split(' ',expand=True)
datetime_df.columns = ['Date','Time']
date_df = datetime_df.Date.str.split('/',expand=True)
date_df.columns = ['Day','Month','Year']
air_df = air_df.join(date_df).join(datetime_df.Time).

drop(columns=['ReadingDateTime','Year'])
air_df
```

```
[56]:
                     Value Day Month
            Species
                                       Time
      0
                 NO
                       3.5 01
                                  01
                                      00:00
      1
                 NO
                       3.6 01
                                  01 01:00
      2
                NO
                       2.2 01
                                  01 02:00
      3
                 NO
                       2.1 01
                                  01 03:00
      4
                                  01 04:00
                 NO
                       3.3 01
```

```
43795
         PM2.5
                  -2.0
                         31
                                12
                                    19:00
43796
         PM2.5
                   6.0
                         31
                                12
                                    20:00
43797
         PM2.5
                   5.0
                         31
                                12
                                    21:00
43798
                                    22:00
         PM2.5
                   5.0
                         31
                                12
43799
         PM2.5
                   6.0
                        31
                                12
                                    23:00
```

[43800 rows x 5 columns]

### Answer:

- Imports the Pandas library and assigns it the alias pd for easier use.
- Reads the CSV file LaqnData.csv into a Pandas DataFrame called air\_df.
- Drops unnecessary columns ('Site', 'Units', 'Provisional or Ratified') from air\_df permanently (inplace=True).
- Takes the ReadingDateTime column (e.g., "01/01/2020 00:00") and splits it into two columns using space ('') as the delimiter, expand=True ensures the split parts are returned as separate columns in a new DataFrame (datetime\_df).
- Renames the columns of datetime\_df to 'Date' and 'Time'.
- Takes the Date column (e.g., "01/01/2020") and splits it into three columns using / as the delimiter. The result is stored in a new DataFrame (date\_df).
- Renames the columns of date\_df to 'Day', 'Month', and 'Year'.
- Joins the new columns (Day, Month, Time) back to the original air\_df. Drops the original ReadingDateTime and Year columns (since they are redundant after splitting).
- b) Run the following code, see its output, and then study the code to answer what does this l

```
[57]: air_df = air_df.set_index(['Month','Day','Time','Species'])
air_df
```

```
[57]:
                                  Value
      Month Day Time Species
      01
             01 00:00 NO
                                    3.5
                 01:00 NO
                                    3.6
                 02:00 NO
                                    2.2
                 03:00 NO
                                    2.1
                 04:00 NO
                                    3.3
      12
                 19:00 PM2.5
                                   -2.0
                 20:00 PM2.5
                                    6.0
                 21:00 PM2.5
                                    5.0
                 22:00 PM2.5
                                    5.0
                 23:00 PM2.5
                                    6.0
```

[43800 rows x 1 columns]

### Answer:

Converts air\_df into a MultiIndex DataFrame by setting the columns ['Month', 'Day', 'Time', 'Species'] as the new index levels.

c) Run the following code, see its output, and then study the code to answer what does this 1

# [58]: air\_df.unstack()

[58] :				Value				
	Speci	es		NO	NO2	NOX	PM10	PM2.5
	Month	Day	Time					
	01	01	00:00	3.5	30.8	36.2	35.7	NaN
			01:00	3.6	31.5	37.0	28.5	NaN
			02:00	2.2	27.3	30.7	22.7	NaN
			03:00	2.1	23.5	26.8	20.5	NaN
			04:00	3.3	28.0	33.0	22.1	NaN
					•••			
	12	31	19:00	0.7	17.5	18.5	16.3	-2.0
			20:00	0.7	17.5	18.6	14.5	6.0
			21:00	0.7	14.1	15.1	8.6	5.0
			22:00	1.1	22.0	23.6	12.5	5.0
			23:00	0.9	19.4	20.7	10.4	6.0

[8760 rows x 5 columns]

### Answer:

Reshapes a MultiIndex DataFrame by "pivoting" one or more levels of the row index into columns, creating a wide-format table.

- d) Compare the output of the code above with pvt\_df from Exercise 4. Are they basically the sa
- e) Explain what are the differences and similarities between the pair .melt()/.pivot() and the
- f) If you were to choose one counterpart for .melt() between .stack()/.unstack() which one wo

## Answer:

- d) Yes
- e) .melt()/.pivot() is to reshape between wide and long formats. .stack()/.unstack() is to reshape between hierarchical indexes and columns. .melt()/.pivot() input dataframes with regular columns. .stack()/.unstack() input dataframes with multiindex rows/columns.
- f) Choose .stack() as the counterpart to .melt().