## Exploratory Data Analysis Two Centuries of Ultra Marathon Data Preprocessing-Gender based Comparison

February 27, 2024

```
[1]: import pandas as pd
     import seaborn as sns
     import matplotlib.pyplot as plt
    /var/folders/jf/719gm8g97dx90xtt2vrht47c0000gn/T/ipykernel_2037/3632437423.py:1:
    DeprecationWarning:
    Pyarrow will become a required dependency of pandas in the next major release of
    pandas (pandas 3.0),
    (to allow more performant data types, such as the Arrow string type, and better
    interoperability with other libraries)
    but was not found to be installed on your system.
    If this would cause problems for you,
    please provide us feedback at https://github.com/pandas-dev/pandas/issues/54466
      import pandas as pd
[2]: df= pd.read_csv('TWO_CENTURIES_OF_UM_RACES.csv')
    /var/folders/jf/719gm8g97dx90xtt2vrht47c0000gn/T/ipykernel_2037/500617103.py:1:
    DtypeWarning: Columns (11) have mixed types. Specify dtype option on import or
    set low memory=False.
      df= pd.read_csv('TWO_CENTURIES_OF_UM_RACES.csv')
[3]: df.head(10)
[3]:
       Year of event Event dates
                                            Event name Event distance/length \
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     0
     1
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     2
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     3
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     4
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     5
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     6
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     7
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
     8
                 2018 06.01.2018 Selva Costera (CHI)
                                                                        50km
```

50km

Athlete club \

2018 06.01.2018 Selva Costera (CHI)

Event number of finishers Athlete performance

```
0
                                               4:51:39 h
                                                                          Tnfrc
                                 22
     1
                                 22
                                               5:15:45 h
                                                            Roberto Echeverría
     2
                                                             Puro Trail Osorno
                                 22
                                               5:16:44 h
     3
                                 22
                                               5:34:13 h
                                                                       Columbia
     4
                                 22
                                               5:54:14 h
                                                                Baguales Trail
     5
                                 22
                                               6:25:01 h
                                                                            NaN
     6
                                 22
                                               6:28:00 h
                                                                 Los Patagones
     7
                                 22
                                               6:32:24 h
                                                                Reaktiva Chile
     8
                                 22
                                                             Puro Trail Osorno
                                               6:39:08 h
     9
                                 22
                                               6:45:11 h Marlene Flores Team
       Athlete country
                         Athlete year of birth Athlete gender Athlete age category \
     0
                    CHI
                                          1978.0
                                                               М
                                                                                    M35
                    CHI
                                          1981.0
                                                                                    M35
     1
                                                               М
     2
                    CHI
                                          1987.0
                                                               Μ
                                                                                    M23
     3
                    ARG
                                          1976.0
                                                                                    M40
                                                               Μ
     4
                    CHI
                                                               М
                                                                                    M23
                                          1992.0
     5
                    ARG
                                          1974.0
                                                               Μ
                                                                                    M40
                                                               F
     6
                    ARG
                                                                                    W35
                                          1979.0
     7
                                                               F
                    CHI
                                          1967.0
                                                                                    W50
     8
                    CHI
                                          1985.0
                                                               М
                                                                                    M23
     9
                    CHI
                                          1976.0
                                                               M
                                                                                    M40
       Athlete average speed
                               Athlete ID
                       10.286
     0
                                          0
     1
                        9.501
                                          1
     2
                        9.472
                                          2
     3
                        8.976
                                          3
     4
                                          4
                        8.469
     5
                        7.792
                                          5
     6
                        7.732
                                          6
     7
                                          7
                        7.645
     8
                                          8
                        7.516
     9
                                          9
                        7.404
     df.shape
[4]: (7461195, 13)
[5]: df.dtypes
[5]: Year of event
                                      int64
     Event dates
                                     object
     Event name
                                     object
     Event distance/length
                                     object
     Event number of finishers
                                      int64
     Athlete performance
                                     object
```

```
object
     Athlete country
     Athlete year of birth
                                   float64
     Athlete gender
                                    object
     Athlete age category
                                    object
     Athlete average speed
                                    object
     Athlete ID
                                     int64
     dtype: object
[6]: #cleaning up data
[7]: #only want 50km or 50 mi
[8]: df[df['Event distance/length'] == '50km']
[8]:
              Year of event Event dates
                                                                       Event name
                                                             Selva Costera (CHI)
                        2018 06.01.2018
     0
                              06.01.2018
                                                             Selva Costera (CHI)
     1
                        2018
     2
                        2018
                              06.01.2018
                                                             Selva Costera (CHI)
     3
                        2018
                              06.01.2018
                                                             Selva Costera (CHI)
     4
                        2018
                              06.01.2018
                                                             Selva Costera (CHI)
     7461089
                        1995
                              07.01.1995
                                          Centenary Lakes 50 Km Track Run (AUS)
                              07.01.1995
                                          Centenary Lakes 50 Km Track Run (AUS)
     7461090
                        1995
     7461091
                              07.01.1995
                                           Centenary Lakes 50 Km Track Run (AUS)
                        1995
     7461092
                        1995
                              07.01.1995
                                           Centenary Lakes 50 Km Track Run (AUS)
                                          Centenary Lakes 50 Km Track Run (AUS)
     7461093
                        1995
                              07.01.1995
             Event distance/length
                                    Event number of finishers Athlete performance \
     0
                               50km
                                                                           4:51:39 h
                                                              22
     1
                               50km
                                                              22
                                                                           5:15:45 h
     2
                                                              22
                                                                           5:16:44 h
                               50km
     3
                                                                           5:34:13 h
                               50km
                                                              22
     4
                               50km
                                                              22
                                                                           5:54:14 h
     7461089
                               50km
                                                              6
                                                                           4:19:56 h
     7461090
                               50km
                                                              6
                                                                           4:28:57 h
     7461091
                               50km
                                                              6
                                                                           4:46:39 h
     7461092
                               50km
                                                              6
                                                                           4:47:39 h
     7461093
                               50km
                                                              6
                                                                           5:58:16 h
                     Athlete club Athlete country Athlete year of birth \
     0
                            Tnfrc
                                               CHI
                                                                    1978.0
     1
              Roberto Echeverría
                                               CHI
                                                                    1981.0
     2
               Puro Trail Osorno
                                               CHI
                                                                    1987.0
     3
                                               ARG
                                                                    1976.0
                         Columbia
     4
                  Baguales Trail
                                               CHI
                                                                    1992.0
```

object

Athlete club

	•••			•				••				
	7461089			*QLD		AUS			1956.0	)		
	7461090			*QLD		AUS			1954.0	)		
	7461091			*QLD		AUS			1951.0	)		
	7461092			*QLD		AUS			1939.0	)		
	7461093			*QLD		AUS			1938.0	)		
				•								
		Athlete	gender	Athlete a	age cat	egory	Athlete	averag	e speed	Athle	te ID	
	0		M			M35			10.286		0	
	1		М			M35			9.501		1	
	2		M			M23			9.472		2	
	3		M			M40			8.976		3	
	4		М			M23			8.469		4	
	•••		•••		•••			•••		•••		
	7461089		F			W35			11541.0	10	46326	
	7461090		М			M40			11154.0		70007	
	7461091		М			M40			10466.0		45672	
	7461092		М			M55			10429.0		82443	
	7461093		F			W55			8374.0		82581	
	1 101000		-						001110	10	02001	
	[1522609	rows x	13 colu	ımnsl								
	[											
[9]:	df[df['F	vent di	stance/1	ength']	== '50m	i'l						
				- 6 -		-						
[9]:		Year of	fevent	Event da	tes \							
	55		2018	06.01.2								
	56		2018	06.01.2								
	57		2018									
	58		2018	06.01.2								
	59		2018	06.01.2								
			2010	00.01.2	010							
	 7461181		 1995	07.01.1	995							
	7461182		1995	07.01.1								
	7461183		1995	07.01.1								
	7461184		1995	07.01.1								
	7461185		1995	07.01.1								
	7401100		1995	07.01.13	995							
							Erront n	omo Erro	nt diata	ngo /1 o	n a+h	\
	c c	V1	C	. FO M+1-	ĭ 7÷ +	Ch = 1 -	Event n		int arsta		ngun 50mi	\
	55			50 Mile			_					
	56			50 Mile			_				50mi	
	57			50 Mile			_				50mi	
	58			50 Mile			_				50mi	
	59	Yankee	Springs	50 Mile	Winter	Chall	lenge (U	SA)			50mi	
				_				>		•••		
	7461181			valon Be							50mi	
	7461182			valon Be							50mi	
	7461183		A	valon Be	nefit 5	O-Mile	e Run (U	SA)			50mi	

```
7461184
                       Avalon Benefit 50-Mile Run (USA)
                                                                             50mi
                       Avalon Benefit 50-Mile Run (USA)
7461185
                                                                             50mi
         Event number of finishers Athlete performance
                                                                Athlete club
55
                                                9:53:05 h
                                                           *Middleville, MI
                                   9
                                               11:09:35 h
56
                                                               *Waterloo, ON
57
                                   9
                                               11:33:00 h
                                                              *Kitchener, ON
                                   9
                                               11:38:17 h
                                                                  *Utica, MI
58
                                   9
                                                             *Grass Lake, MI
59
                                               11:56:35 h
                                                  •••
                                               11:59:37 h
7461181
                                  92
                                                                          NaN
7461182
                                  92
                                               12:01:41 h
                                                                          NaN
7461183
                                  92
                                               12:03:26 h
                                                                          NaN
7461184
                                  92
                                               12:03:26 h
                                                                          NaN
7461185
                                  92
                                               12:05:59 h
                                                                          NaN
        Athlete country Athlete year of birth Athlete gender
55
                     USA
                                           1983.0
                     CAN
                                                                F
56
                                           1977.0
57
                     CAN
                                           1976.0
                                                                М
                     USA
58
                                           1986.0
                                                                Μ
59
                     USA
                                           1988.0
                                                                М
7461181
                     USA
                                           1941.0
                                                                М
7461182
                     USA
                                           1932.0
                                                                Μ
                                                                F
7461183
                     USA
                                           1934.0
                                                                F
7461184
                     USA
                                           1951.0
7461185
                     USA
                                           1947.0
                                                                F
        Athlete age category Athlete average speed Athlete ID
55
                                                8.141
                                                                55
                          M23
                                                7.211
56
                           W40
                                                                56
57
                                                6.967
                                                                57
                           M40
58
                          M23
                                                6.914
                                                                58
59
                          M23
                                                6.738
                                                                59
                                               6709.0
                                                           1045603
7461181
                          M50
7461182
                                               6690.0
                                                           1070463
                          M60
7461183
                          W60
                                               6674.0
                                                            416139
7461184
                          W40
                                               6674.0
                                                           1098098
7461185
                                               6650.0
                           W45
                                                           1626367
[352181 rows x 13 columns]
```

```
[10]: #now we have to combine both 50 miles and 50 Km
```

[11]: df[df['Event distance/length'].isin(['50km','50mi'])]

```
[11]:
               Year of event Event dates
                                                                   Event name \
                         2018 06.01.2018
                                                         Selva Costera (CHI)
      0
      1
                         2018
                               06.01.2018
                                                         Selva Costera (CHI)
      2
                         2018
                               06.01.2018
                                                         Selva Costera (CHI)
      3
                               06.01.2018
                                                         Selva Costera (CHI)
                         2018
      4
                         2018
                               06.01.2018
                                                         Selva Costera (CHI)
                                            Avalon Benefit 50-Mile Run (USA)
      7461181
                         1995
                               07.01.1995
      7461182
                               07.01.1995 Avalon Benefit 50-Mile Run (USA)
                         1995
                               07.01.1995 Avalon Benefit 50-Mile Run (USA)
      7461183
                         1995
      7461184
                               07.01.1995 Avalon Benefit 50-Mile Run (USA)
                         1995
      7461185
                         1995 07.01.1995 Avalon Benefit 50-Mile Run (USA)
              Event distance/length Event number of finishers Athlete performance \
      0
                                50km
                                                               22
                                                                             4:51:39 h
                                50km
                                                                             5:15:45 h
      1
                                                               22
      2
                                50km
                                                               22
                                                                             5:16:44 h
      3
                                50km
                                                               22
                                                                             5:34:13 h
      4
                                50km
                                                               22
                                                                             5:54:14 h
      7461181
                                50mi
                                                               92
                                                                            11:59:37 h
      7461182
                                50mi
                                                               92
                                                                            12:01:41 h
      7461183
                                50mi
                                                               92
                                                                            12:03:26 h
      7461184
                                50mi
                                                                            12:03:26 h
                                                               92
      7461185
                                50mi
                                                               92
                                                                            12:05:59 h
                      Athlete club Athlete country Athlete year of birth \
      0
                             Tnfrc
                                                CHI
                                                                     1978.0
               Roberto Echeverría
                                                CHI
      1
                                                                     1981.0
                Puro Trail Osorno
                                                CHI
                                                                     1987.0
      3
                          Columbia
                                                ARG
                                                                     1976.0
      4
                   Baguales Trail
                                                CHI
                                                                     1992.0
                                                                     1941.0
      7461181
                                                USA
                               NaN
                                                USA
                                                                     1932.0
      7461182
                               NaN
                                                USA
      7461183
                               NaN
                                                                     1934.0
      7461184
                               NaN
                                                USA
                                                                     1951.0
      7461185
                               NaN
                                                USA
                                                                     1947.0
              Athlete gender Athlete age category Athlete average speed
                                                                            Athlete ID
      0
                                                M35
                                                                    10.286
                                                                                      0
      1
                            М
                                                M35
                                                                     9.501
                                                                                      1
      2
                            М
                                                M23
                                                                     9.472
                                                                                      2
      3
                                                                     8.976
                                                                                      3
                            М
                                                M40
      4
                            М
                                                M23
                                                                     8.469
      7461181
                            Μ
                                                M50
                                                                    6709.0
                                                                                1045603
```

```
7461183
                           F
                                               W60
                                                                   6674.0
                                                                               416139
                           F
      7461184
                                               W40
                                                                   6674.0
                                                                              1098098
      7461185
                           F
                                                                   6650.0
                                               W45
                                                                              1626367
      [1874790 rows x 13 columns]
[12]: df[df['Event name'] == 'Everglades 50 Mile Ultra Run (USA)']['Event name'].str.
       ⇔split('(').str.get(1).str.split(')').str.get(0)
[12]: 51923
                 USA
      51924
                 USA
      51925
                 USA
      51926
                 USA
      51927
                 USA
      6417091
                 USA
      6417092
                 USA
      6417093
                 USA
      6417094
                 USA
      6417095
                 USA
      Name: Event name, Length: 338, dtype: object
[13]: #this way we have all the races in USA
[14]: df[df['Event name'].str.split('(').str.get(1).str.split(')').str.get(0) ==__

    'USA'
]
[14]:
               Year of event Event dates \
      55
                        2018 06.01.2018
      56
                        2018
                              06.01.2018
      57
                              06.01.2018
                        2018
      58
                        2018
                              06.01.2018
                              06.01.2018
      59
                        2018
                              07.01.1995
      7461181
                        1995
      7461182
                        1995 07.01.1995
      7461183
                        1995 07.01.1995
                        1995 07.01.1995
      7461184
      7461185
                        1995 07.01.1995
                                                   Event name Event distance/length \
      55
                                                                                50mi
               Yankee Springs 50 Mile Winter Challenge (USA)
      56
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                50mi
      57
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                50mi
      58
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                50mi
      59
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                50mi
```

M60

6690.0

1070463

7461182

Μ

•••			•	•••
7461181	Avalon Benefit	50-Mile Run (	(USA)	50mi
7461182	Avalon Benefit	50-Mile Run (	(USA)	50mi
7461183	Avalon Benefit	50-Mile Run (	(USA)	50mi
7461184	Avalon Benefit	50-Mile Run (	(USA)	50mi
7461185	Avalon Benefit	50-Mile Run (	(USA)	50mi
Event number	of finishers A	thlete perform	nance Ath	lete club \
55	9	9:53:	05 h *Middle	ville, MI
56	9	11:09:	35 h *Wat	erloo, ON
57	9	11:33:	00 h *Kitc	hener, ON
58	9	11:38:	17 h *	Utica, MI
59	9	11:56:	35 h *Grass	Lake, MI
	•••	•••		•••
7461181	92	11:59:	37 h	NaN
7461182	92	12:01:	41 h	NaN
7461183	92	12:03:	26 h	NaN
7461184	92	12:03:	26 h	NaN
7461185	92	12:05:	59 h	NaN
Athlete count	ry Athlete yea	r of birth Ath	lete gender	\
55 T	ISA	1983.0	M	
56	CAN	1977.0	F	
57	CAN	1976.0	M	
58 U	ISA	1986.0	M	
59 U	ISA	1988.0	M	
		•••	•••	
7461181 U	ISA	1941.0	M	
7461182 U	ISA	1932.0	M	
7461183 U	ISA	1934.0	F	
7461184 U	ISA	1951.0	F	
7461185 U	ISA	1947.0	F	
Athlete age o	ategory Athlete	average speed	d Athlete ID	
55	M23	8.141	55	
56	W40	7.211	56	
57	M40	6.967	7 57	
58	M23	6.914	£ 58	
59	M23	6.738	3 59	
•••	•••	•••	•••	
7461181	M50	6709.0	1045603	
7461182	M60	6690.0		
7461183	W60	6674.0		
7461184	W40	6674.0		
7461185	W45	6650.0		

[1398540 rows x 13 columns]

```
[15]: #combine all data filters
[16]: df2 = df[(df['Event distance/length'].isin(['50km', '50mi'])) & (df['Event<sub>||</sub>
       aname'].str.split('(').str.get(1).str.split(')').str.get(0) == 'USA')]
[17]: df2
[17]:
               Year of event Event dates
      55
                         2018
                              06.01.2018
      56
                         2018
                               06.01.2018
                               06.01.2018
      57
                         2018
      58
                         2018
                               06.01.2018
      59
                         2018
                               06.01.2018
      7461181
                         1995
                               07.01.1995
      7461182
                               07.01.1995
                         1995
      7461183
                               07.01.1995
                         1995
      7461184
                         1995
                               07.01.1995
      7461185
                               07.01.1995
                         1995
                                                    Event name Event distance/length \
      55
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                  50mi
      56
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                  50mi
               Yankee Springs 50 Mile Winter Challenge (USA)
      57
                                                                                  50mi
      58
               Yankee Springs 50 Mile Winter Challenge (USA)
                                                                                  50mi
               Yankee Springs 50 Mile Winter Challenge (USA)
      59
                                                                                  50mi
      7461181
                             Avalon Benefit 50-Mile Run (USA)
                                                                                  50mi
      7461182
                             Avalon Benefit 50-Mile Run (USA)
                                                                                  50mi
      7461183
                             Avalon Benefit 50-Mile Run (USA)
                                                                                  50mi
      7461184
                             Avalon Benefit 50-Mile Run (USA)
                                                                                  50mi
      7461185
                             Avalon Benefit 50-Mile Run (USA)
                                                                                  50mi
               Event number of finishers Athlete performance
                                                                     Athlete club
      55
                                         9
                                                      9:53:05 h
                                                                 *Middleville, MI
      56
                                         9
                                                     11:09:35 h
                                                                    *Waterloo, ON
                                         9
                                                     11:33:00 h
                                                                   *Kitchener, ON
      57
      58
                                         9
                                                     11:38:17 h
                                                                        *Utica, MI
      59
                                         9
                                                     11:56:35 h
                                                                  *Grass Lake, MI
      7461181
                                        92
                                                     11:59:37 h
                                                                               NaN
      7461182
                                        92
                                                     12:01:41 h
                                                                               NaN
      7461183
                                        92
                                                     12:03:26 h
                                                                               NaN
      7461184
                                        92
                                                     12:03:26 h
                                                                               NaN
      7461185
                                        92
                                                     12:05:59 h
                                                                               NaN
```

Athlete country Athlete year of birth Athlete gender \

```
55
                           USA
                                                1983.0
                                                                     Μ
      56
                           CAN
                                                1977.0
                                                                     F
      57
                           CAN
                                                1976.0
                                                                     Μ
      58
                           USA
                                                1986.0
                                                                     Μ
      59
                           USA
                                                1988.0
                                                                     М
      7461181
                           USA
                                                1941.0
                                                                     Μ
                                                                     Μ
      7461182
                           USA
                                                1932.0
                           USA
                                                                     F
      7461183
                                                1934.0
      7461184
                           USA
                                                1951.0
                                                                     F
      7461185
                           USA
                                                1947.0
                                                                     F
              Athlete age category Athlete average speed Athlete ID
      55
                                M23
                                                     8.141
                                                                     55
      56
                                W40
                                                     7.211
                                                                     56
      57
                                M40
                                                     6.967
                                                                     57
      58
                                M23
                                                     6.914
                                                                     58
      59
                                                     6.738
                                                                     59
                                M23
      7461181
                                M50
                                                    6709.0
                                                               1045603
      7461182
                                                    6690.0
                                                               1070463
                                M60
      7461183
                                                    6674.0
                                W60
                                                                416139
      7461184
                                W40
                                                    6674.0
                                                               1098098
      7461185
                                                    6650.0
                                W45
                                                               1626367
      [926241 rows x 13 columns]
[18]: df2.shape
[18]: (926241, 13)
[19]: #removing usa from eventsname
[20]: df2['Event name'] = df2['Event name'].str.split('(').str.get(0)
     /var/folders/jf/719gm8g97dx90xtt2vrht47c0000gn/T/ipykernel_2037/3473829760.py:1:
     SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       df2['Event name'] = df2['Event name'].str.split('(').str.get(0)
[21]: df2.head()
```

```
[21]:
          Year of event Event dates
                                                                     Event name \
      55
                   2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
      56
                   2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
      57
                   2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
                   2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
      58
      59
                   2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
         Event distance/length Event number of finishers Athlete performance
                          50mi
                                                                      9:53:05 h
      55
                                                         9
                          50mi
                                                         9
                                                                     11:09:35 h
      56
                          50mi
                                                         9
                                                                     11:33:00 h
      57
                          50mi
                                                         9
                                                                     11:38:17 h
      58
                          50mi
                                                         9
                                                                     11:56:35 h
      59
              Athlete club Athlete country
                                             Athlete year of birth Athlete gender
          *Middleville, MI
                                        USA
                                                            1983.0
      55
      56
             *Waterloo, ON
                                        CAN
                                                            1977.0
                                                                                 F
            *Kitchener, ON
                                        CAN
                                                            1976.0
                                                                                 Μ
      57
                                                            1986.0
                *Utica, MI
                                        USA
                                                                                 Μ
      58
      59
           *Grass Lake, MI
                                        USA
                                                            1988.0
                                                                                 Μ
         Athlete age category Athlete average speed Athlete ID
      55
                          M23
                                               8.141
      56
                          W40
                                               7.211
                                                              56
      57
                          M40
                                               6.967
                                                              57
                          M23
                                               6.914
      58
                                                              58
      59
                          M23
                                               6.738
                                                              59
[22]: # lets remove the 'h' from that athlete performance
[23]: df2['Athlete performance'] = df2['Athlete performance'].str.split(' ').str.

get(0)
     /var/folders/jf/719gm8g97dx90xtt2vrht47c0000gn/T/ipykernel_2037/2477507555.py:1:
     SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       df2['Athlete performance'] = df2['Athlete performance'].str.split('
     ').str.get(0)
[24]: df2.head(10)
[24]:
          Year of event Event dates
                                                                    Event name \
```

2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge

55

```
56
             2018
                   06.01.2018 Yankee Springs 50 Mile Winter Challenge
57
             2018
                   06.01.2018
                               Yankee Springs 50 Mile Winter Challenge
58
              2018
                    06.01.2018
                                 Yankee Springs 50 Mile Winter Challenge
59
              2018
                    06.01.2018
                                 Yankee Springs 50 Mile Winter Challenge
60
              2018
                   06.01.2018
                                 Yankee Springs 50 Mile Winter Challenge
61
             2018
                   06.01.2018
                                 Yankee Springs 50 Mile Winter Challenge
62
             2018 06.01.2018
                                 Yankee Springs 50 Mile Winter Challenge
                                 Yankee Springs 50 Mile Winter Challenge
63
             2018
                    06.01.2018
              2018 06.01.2018
                                   Yankee Springs 50 km Winter Challenge
64
   Event distance/length Event number of finishers Athlete performance
55
                     50mi
                                                                    9:53:05
                     50mi
56
                                                     9
                                                                   11:09:35
                     50mi
57
                                                     9
                                                                   11:33:00
                     50mi
                                                     9
58
                                                                   11:38:17
59
                     50mi
                                                     9
                                                                   11:56:35
                     50mi
                                                     9
60
                                                                   12:32:16
61
                     50mi
                                                     9
                                                                   12:39:36
                     50mi
                                                     9
62
                                                                   12:39:36
63
                     50mi
                                                     9
                                                                   13:24:05
64
                     50km
                                                                    5:09:40
                                                    36
                                         Athlete year of birth Athlete gender
         Athlete club Athlete country
     *Middleville, MI
55
                                    USA
                                                          1983.0
56
        *Waterloo, ON
                                    CAN
                                                          1977.0
                                                                               F
57
       *Kitchener, ON
                                    CAN
                                                          1976.0
                                                                               Μ
58
           *Utica, MI
                                    USA
                                                          1986.0
59
      *Grass Lake, MI
                                    USA
                                                         1988.0
                                                                               М
60
          *Olaton, KY
                                    USA
                                                         1995.0
                                                                               Μ
61
         *Wyoming, MI
                                    USA
                                                         1979.0
                                                                               М
62
    *Grand Rapids, MI
                                                         1977.0
                                                                               F
                                    USA
                                                                               F
63
         *Lansing, MI
                                    USA
                                                          1990.0
                                                                               F
64
          *Okemos, MI
                                    USA
                                                          1991.0
   Athlete age category Athlete average speed
                                                  Athlete ID
55
                     M23
                                           8.141
                                                           55
56
                     W40
                                           7.211
                                                           56
57
                     M40
                                           6.967
                                                           57
58
                     M23
                                           6.914
                                                           58
59
                     M23
                                           6.738
                                                           59
60
                    MU23
                                           6.418
                                                           60
61
                     M35
                                           6.356
                                                           61
62
                     W40
                                           6.356
                                                           62
63
                     W23
                                           6.004
                                                           63
64
                     W23
                                           9.688
                                                           64
```

[25]: #lets drop columns that arent important

```
[26]: # athlete club, country, year of birth, age category
[27]: df2 = df2.drop(['Athlete club', 'Athlete country', 'Athlete year of

obirth','Athlete age category'], axis = 1)
[28]: df2.head(10)
[28]:
          Year of event Event dates
                                                                      Event name
      55
                   2018 06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      56
                   2018
                         06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
                         06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      57
                   2018
      58
                   2018
                         06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      59
                   2018
                         06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      60
                   2018 06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      61
                   2018 06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
                   2018 06.01.2018
                                     Yankee Springs 50 Mile Winter Challenge
      62
                   2018 06.01.2018
                                      Yankee Springs 50 Mile Winter Challenge
      63
      64
                   2018 06.01.2018
                                        Yankee Springs 50 km Winter Challenge
         Event distance/length Event number of finishers Athlete performance
      55
                           50mi
                                                                         9:53:05
      56
                           50mi
                                                          9
                                                                        11:09:35
      57
                           50mi
                                                          9
                                                                        11:33:00
                           50mi
                                                          9
      58
                                                                        11:38:17
      59
                           50mi
                                                          9
                                                                        11:56:35
                           50mi
                                                          9
      60
                                                                        12:32:16
                           50mi
                                                          9
      61
                                                                        12:39:36
      62
                           50mi
                                                          9
                                                                        12:39:36
      63
                           50mi
                                                          9
                                                                        13:24:05
      64
                           50km
                                                         36
                                                                         5:09:40
         Athlete gender Athlete average speed
                                                Athlete ID
      55
                                         8.141
                      М
                                                         55
                      F
                                         7.211
      56
                                                         56
                      М
                                         6.967
      57
                                                         57
      58
                      М
                                         6.914
                                                         58
      59
                      М
                                         6.738
                                                         59
      60
                      М
                                         6.418
                                                         60
                                         6.356
      61
                      М
                                                         61
                       F
      62
                                         6.356
                                                         62
                       F
      63
                                         6.004
                                                         63
      64
                       F
                                         9.688
                                                         64
[29]: # lets check for null values in our table
```

[30]: df2.isna().sum()

```
[30]: Year of event
                                     0
                                     0
      Event dates
      Event name
                                     0
      Event distance/length
                                     0
      Event number of finishers
                                     0
      Athlete performance
                                     0
      Athlete gender
                                     0
      Athlete average speed
                                     0
      Athlete ID
                                     0
      dtype: int64
[31]: # no null values--- our data is clean
[32]: # lets check for duplicate values
[33]: df2[df2.duplicated() == True]
[33]:
               Year of event
                                   Event dates
                         2016
                               24.-25.09.2016
      1073758
      1087007
                         2016
                                    17.09.2016
                                    10.09.2016
      1103619
                         2016
      1317290
                         2017
                                    18.03.2017
      1399606
                         2017
                                    13.05.2017
      3540783
                         2022
                                    17.12.2022
      4238708
                         2005
                                    30.07.2005
      4290600
                         2005
                                    26.03.2005
                               19.-20.06.2009
      4666132
                         2009
      4698963
                         2009
                                    09.05.2009
                                    19.09.2009
      4794364
                         2009
      5123404
                         2011
                                    09.07.2011
      5541799
                         2012
                                    13.10.2012
      5542079
                         2012
                                    13.10.2012
      5553711
                         2012
                                    06.10.2012
      5553791
                         2012
                                    06.10.2012
      5579518
                         2013
                                    06.04.2013
      5682076
                         2013
                                    01.06.2013
      5908250
                         2013
                                    05.10.2013
                         2014
                                    06.09.2014
      6198571
      6299545
                         2014
                                    26.10.2014
      6343970
                         2015
                                    11.04.2015
                                    11.04.2015
      6344012
                         2015
                                    29.03.2015
      6373940
                         2015
      7328184
                         1992
                                    25.04.1992
                                                      Event name Event distance/length \
      1073758
                                          Not Yo Momma's 50 km
                                                                                   50km
      1087007
                                      The Barkley Fall Classic
                                                                                   50km
```

4400040	T D. 507		501
1103619	Los Pinos 50K		50km
1317290	Lake Martin 50 Mile Ultra Trail Race		50mi
1399606	Quad Rock 50 Mile		50mi
3540783	Cave Creek Thriller 50K Race		50km
4238708	Pacific Crest 50 km Trail Run		50km
4290600	San Juan Trail 50K		50 km
4666132	Bighorn Mountain Wild & Scenic 50km Trail Run		50 km
4698963	Endurance Challenge - New York Trail 50km		50 km
4794364	Youngstown Ultra Trail Classic 50K		50 km
5123404	Cuyamaca Three Peaks 50K Run		50km
5541799	Market to Market 50		50km
5542079	Twin Peaks 50K		50km
5553711	Rock/Creek StumpJump 50K		50km
5553791	Rock/Creek StumpJump 50K		50km
5579518	American River 50 Mile Endurance Run		50mi
5682076	Rainier to Ruston Rail-Trail 50 Mile Ultra		50mi
5908250	Rock/Creek StumpJump 50K		50km
6198571	Volcanic 50		50km
6299545	G.O.A.T.z 50km Trail Run		50km
6343970	Lake Sonoma 50 Mile Race		50mi
6344012	Lake Sonoma 50 Mile Race		50mi
6373940	Gorge Waterfalls 50k		50km
7328184	Cuyamaca 50 Km Trail Race		50km
7020101	ouyamaca oo hiii ilali hacc		OOM
	Event number of finishers Athlete performance	Athlete gender	\
1073758	Event number of finishers Athlete performance 22 11:11:22	Athlete gender	\
1073758 1087007	_	=	\
1087007	22 11:11:22 120 10:56:16	М	\
1087007 1103619	22 11:11:22 120 10:56:16 67 9:31:29	M F M	\
1087007 1103619 1317290	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39	M F M M	\
1087007 1103619 1317290 1399606	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39 107 13:48:21	М F М М	\
1087007 1103619 1317290 1399606 3540783	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39 107 13:48:21 76 5:51:02	M F M M M	\
1087007 1103619 1317290 1399606 3540783 4238708	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39 107 13:48:21 76 5:51:02 104 6:19:39	M F M M M M	\
1087007 1103619 1317290 1399606 3540783 4238708 4290600	22	M F M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39 107 13:48:21 76 5:51:02 104 6:19:39 62 8:12:37 137 8:32:34	M F M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963	22 11:11:22 120 10:56:16 67 9:31:29 77 10:08:39 107 13:48:21 76 5:51:02 104 6:19:39 62 8:12:37 137 8:32:34 157 7:44:54	M F M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364	22	M F M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404	22	M F M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26	M F M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42	M F M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46	M F M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711 5553791	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47	M F M M M M M M M M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711 5553791 5579518	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47         835       11:54:55	M F M M M M M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5553711 5553791 5579518 5682076	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47         835       11:54:55         60       10:46:21	M F M M M M M M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711 5553791 5579518 5682076 5908250	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47         835       11:54:55         60       10:46:21         343       6:24:00	M F M M M M M M M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711 5553791 5579518 5682076 5908250 6198571	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47         835       11:54:55         60       10:46:21         343       6:24:00         192       11:07:59	M F M M M M M M M M M M M M M M M M M M	
1087007 1103619 1317290 1399606 3540783 4238708 4290600 4666132 4698963 4794364 5123404 5541799 5542079 5553711 5553791 5579518 5682076 5908250	22       11:11:22         120       10:56:16         67       9:31:29         77       10:08:39         107       13:48:21         76       5:51:02         104       6:19:39         62       8:12:37         137       8:32:34         157       7:44:54         71       8:45:36         65       6:01:00         114       5:34:26         23       9:39:42         410       7:07:46         410       7:44:47         835       11:54:55         60       10:46:21         343       6:24:00	M F M M M M M M M M M M M M M M M M M	

```
9:18:19
      6373940
                                       284
                                                        6:52:32
                                                                              М
      7328184
                                       131
                                                        6:04:58
                                                                              М
              Athlete average speed
                                      Athlete ID
                               4.468
      1073758
                                            26206
      1087007
                               4.571
                                           333576
      1103619
                               5.249
                                           366578
      1317290
                               7.932
                                            34702
      1399606
                               5.828
                                            33474
      3540783
                               8.546
                                           863243
      4238708
                               7.902
                                            94618
      4290600
                                6.09
                                             4033
      4666132
                               5.853
                                           683378
      4698963
                               6.453
                                            84162
      4794364
                               5.708
                                           337937
      5123404
                                8.31
                                           297664
      5541799
                                8.97
                                           510488
      5542079
                               5.175
                                            13614
      5553711
                               7.013
                                           387266
      5553791
                               6.455
                                           118915
      5579518
                               6.753
                                           544285
      5682076
                                7.47
                                          1392324
      5908250
                               7.813
                                            31507
      6198571
                               4.491
                                           568468
      6299545
                                8.31
                                           102947
      6343970
                                9.88
                                           143697
      6344012
                                            27559
                               8.647
      6373940
                               7.272
                                             1381
      7328184
                              8220.0
                                          1085158
[34]: # we have to drop duplicated data
[35]: df2 = df2.drop_duplicates()
[36]:
      df2.shape
[36]: (926216, 9)
[37]:
      # reset index
[38]: df2.reset_index(drop = True)
[38]:
              Year of event Event dates
                                                                           Event name \
      0
                              06.01.2018
                                           Yankee Springs 50 Mile Winter Challenge
                        2018
      1
                        2018
                              06.01.2018
                                           Yankee Springs 50 Mile Winter Challenge
      2
                                           Yankee Springs 50 Mile Winter Challenge
                        2018
                              06.01.2018
```

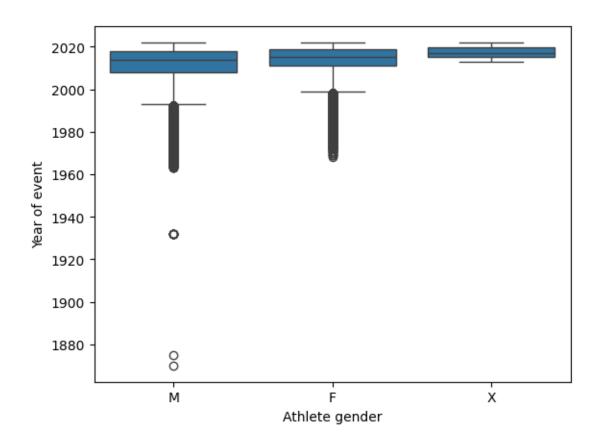
278

Μ

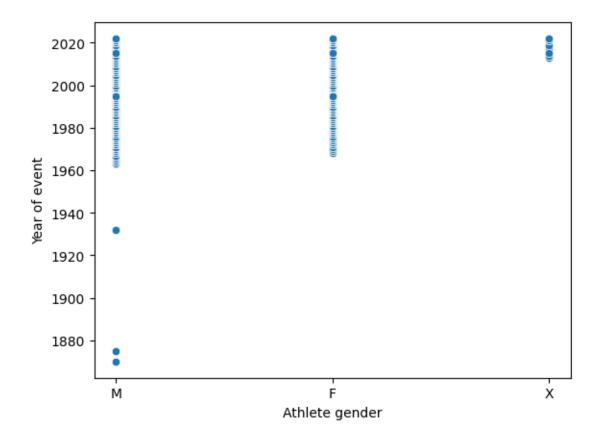
6344012

```
3
                       2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
      4
                       2018 06.01.2018 Yankee Springs 50 Mile Winter Challenge
                       1995
                              07.01.1995
                                                        Avalon Benefit 50-Mile Run
      926211
      926212
                       1995 07.01.1995
                                                        Avalon Benefit 50-Mile Run
      926213
                       1995 07.01.1995
                                                        Avalon Benefit 50-Mile Run
      926214
                       1995
                              07.01.1995
                                                        Avalon Benefit 50-Mile Run
                       1995
                             07.01.1995
                                                        Avalon Benefit 50-Mile Run
      926215
             Event distance/length Event number of finishers Athlete performance
                               50mi
      0
                                                                             9:53:05
      1
                               50mi
                                                              9
                                                                            11:09:35
      2
                               50mi
                                                              9
                                                                            11:33:00
      3
                               50mi
                                                              9
                                                                            11:38:17
      4
                                                              9
                               50mi
                                                                            11:56:35
      926211
                               50mi
                                                             92
                                                                            11:59:37
      926212
                                                             92
                                                                            12:01:41
                               50mi
                                                             92
      926213
                               50mi
                                                                            12:03:26
      926214
                               50mi
                                                             92
                                                                            12:03:26
      926215
                               50mi
                                                             92
                                                                            12:05:59
             Athlete gender Athlete average speed Athlete ID
                                             8.141
      0
                          Μ
                                                             55
      1
                           F
                                             7.211
                                                             56
      2
                          Μ
                                             6.967
                                                             57
      3
                          Μ
                                             6.914
                                                             58
      4
                                             6.738
                                                             59
                           Μ
      926211
                                            6709.0
                                                        1045603
                           М
      926212
                           М
                                            6690.0
                                                        1070463
      926213
                           F
                                            6674.0
                                                        416139
                           F
      926214
                                            6674.0
                                                        1098098
                                            6650.0
      926215
                                                        1626367
      [926216 rows x 9 columns]
[39]: #since the data is clean... we can state the visualization
[40]: sns.boxplot(data=df2, x='Athlete gender', y='Year of event')
```

plt.show()



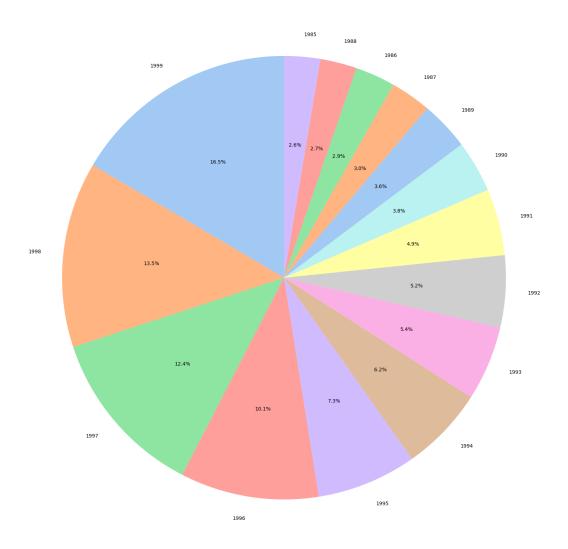
```
[41]: # Create the scatter plot
sns.scatterplot(data=df2, x='Athlete gender', y='Year of event')
plt.show()
```



```
[42]: data = df2['Year of event'].value_counts()

# Filter data to start from 1985 to 1999
filtered_data = data[(data.index >= 1985) & (data.index <= 1999)]

# Create a pie chart
plt.figure(figsize=(20, 20))
plt.pie(filtered_data, labels=filtered_data.index, autopct='%1.1f%%', useratangle=90, colors=sns.color_palette('pastel'))
plt.title('Distribution of Column Values Starting from 1985')
plt.show()</pre>
```



```
[43]: # Assuming 'Year of event' is the column you want to visualize
# You may replace it with the actual column name in your DataFrame
data = df2['Year of event'].value_counts()

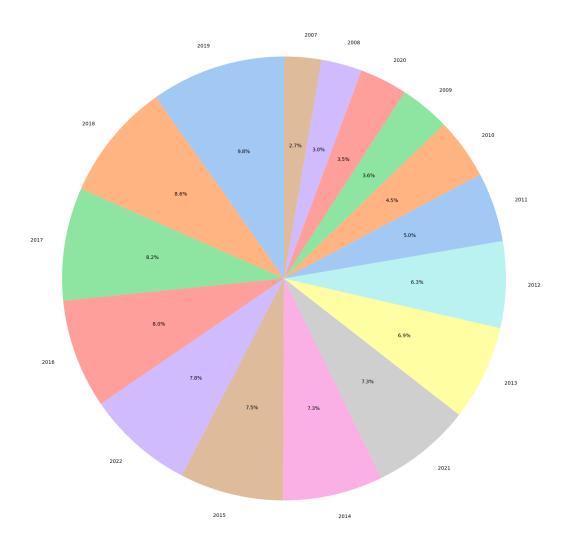
# Filter data to start from 2000 to 2024
filtered_data = data[(data.index >= 2007) & (data.index <= 2024)]

# Create a pie chart
plt.figure(figsize=(20, 20))
plt.pie(filtered_data, labels=filtered_data.index, autopct='%1.1f%%',

startangle=90, colors=sns.color_palette('pastel'))
plt.title('Distribution of Column Values Starting from 2007')</pre>
```

## plt.show()

Distribution of Column Values Starting from 2007



[]: []: