

```
In [104... import pandas as pd
import seaborn as sns
import numpy as np
import warnings
warnings.filterwarnings('ignore')
```

```
In [105... df=pd.read_csv("TWO_CENTURIES_OF_UM_RACES.csv")
```

```
In [106... df.head(5)
```

Out[106]:

	Year of event	Event dates	Event name	distance/length	Event number of finishers	Athlete performance	Athlete club	Athle count
0	2018	06.01.2018	Selva Costera (CHI)	50km	22	4:51:39 h	Tnfr	C
1	2018	06.01.2018	Selva Costera (CHI)	50km	22	5:15:45 h	Roberto Echeverría	C
2	2018	06.01.2018	Selva Costera (CHI)	50km	22	5:16:44 h	Puro Trail Osorno	C
3	2018	06.01.2018	Selva Costera (CHI)	50km	22	5:34:13 h	Columbia	AF
4	2018	06.01.2018	Selva Costera (CHI)	50km	22	5:54:14 h	Baguales Trail	C

```
In [107... df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7117634 entries, 0 to 7117633
Data columns (total 13 columns):
 #   Column                                Dtype
---  -
 0   Year of event                        int64
 1   Event dates                          object
 2   Event name                           object
 3   Event distance/length                object
 4   Event number of finishers            int64
 5   Athlete performance                  object
 6   Athlete club                         object
 7   Athlete country                      object
 8   Athlete year of birth                float64
 9   Athlete gender                       object
10   Athlete age category                 object
11   Athlete average speed                object
12   Athlete ID                           int64
dtypes: float64(1), int64(3), object(9)
memory usage: 705.9+ MB

```

```
In [108...] df.shape
```

```
Out[108]: (7117634, 13)
```

```
In [109...] #Investigating how many different distance in UM in dataset
```

```
In [110...] df["Event distance/length"].value_counts()
```

```

Out[110]: Event distance/length
50km                1503475
100km               883268
50mi                333685
56km                274234
24h                 172811
...
504km/7Etappen      1
303mi                1
186mi                1
101miles             1
137.5km/3Etappen    1
Name: count, Length: 2131, dtype: int64

```

```

In [111...] #We will work on only the distance 50km and 50mil in 2020
#Now check the distance 50km and 50mil in 2020

```

```
In [112...] df[(df["Event distance/length"].isin(["50km","50mi"])) & (df["Year of eve
```

```

Out[112]:

```

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Ath
			Taipei				
			48hr				
			Ultra				

2538571	2020	07.-09.02.2020	Marathon - 50mi (TPE)	50mi	38	7:34:19 h	
2538572	2020	07.-09.02.2020	Taipei 48hr Ultra Marathon - 50mi (TPE)	50mi	38	7:43:50 h	
2538573	2020	07.-09.02.2020	Taipei 48hr Ultra Marathon - 50mi (TPE)	50mi	38	8:04:40 h	
2538574	2020	07.-09.02.2020	Taipei 48hr Ultra Marathon - 50mi (TPE)	50mi	38	8:30:49 h	台灣
2538575	2020	07.-09.02.2020	Taipei 48hr Ultra Marathon - 50mi (TPE)	50mi	38	8:34:47 h	
...	...	...	...	...	...	...	
2762404	2020	03.10.2020	Bison Ultra- Trail 50 (POL)	50km	271	7:36:25 h	Ak ,
2762405	2020	03.10.2020	Bison Ultra- Trail 50 (POL)	50km	271	7:36:27 h	*1
2762406	2020	03.10.2020	Bison Ultra- Trail 50 (POL)	50km	271	7:44:18 h	
2762407	2020	03.10.2020	Bison Ultra- Trail 50 (POL)	50km	271	8:04:50 h	P
2762408	2020	03.10.2020	Bison Ultra- Trail 50 (POL)	50km	271	8:11:43 h	Alek

63489 rows × 13 columns

In [113...

# Investigating UMs in USA

In [114...

df[df["Event name"].str.contains("USA",na=False)]

Out[114]:

		Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlete
	55	2018	06.01.2018	Yankee Springs 50 Mile Winter Challenge (USA)	50mi	9	9:53:05 h	*Middle
	56	2018	06.01.2018	Yankee Springs 50 Mile Winter Challenge (USA)	50mi	9	11:09:35 h	*Wate
	57	2018	06.01.2018	Yankee Springs 50 Mile Winter Challenge (USA)	50mi	9	11:33:00 h	*Kitch
	58	2018	06.01.2018	Yankee Springs 50 Mile Winter Challenge (USA)	50mi	9	11:38:17 h	*Utic
	59	2018	06.01.2018	Yankee Springs 50 Mile Winter Challenge (USA)	50mi	9	11:56:35 h	*Grass l
	...	...	...	...	...	...	...	...
	7117228	2015	09.10.2015	West Virginia Trilogy 50 km (USA)	50km	79	9:40:15 h	*Penns
	7117229	2015	09.10.2015	West Virginia Trilogy 50 km (USA)	50km	79	9:49:58 h	*Fento
				West Virginia				

7117230	2015	09.10.2015	Trilogy 50 km (USA)	50km	79	9:49:58 h	*Kimba
7117231	2015	09.10.2015	West Virginia Trilogy 50 km (USA)	50km	79	9:53:02 h	*Cumber
7117232	2015	09.10.2015	West Virginia Trilogy 50 km (USA)	50km	79	10:22:10 h	*Morgant

1365325 rows × 13 columns

```
In [115... #Combining the filters which for the distance 50km and 50mi and for UMs i
```

```
In [116... df[(df["Event distance/length"].isin(["50km","50mi"])) & (df["Year of eve
```

Out[116]:

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athle clu
2539945	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	3:17:55 h	*Normanc Park, W
2539946	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:02:32 h	*Gold B W
2539947	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:07:57 h	*Vasho W
2539948	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:22:02 h	*G Harbor, W

2539949	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:27:34 h	*Bainbridg Island, W
...	...	...	...	...	...	...	...
2760957	2020	03.10.2020	Yankee Springs Fall Trail Run Festival (USA)	50km	30	7:07:48 h	*Ea Lansing, I
2760958	2020	03.10.2020	Yankee Springs Fall Trail Run Festival (USA)	50km	30	7:27:22 h	*Travers City, I
2760959	2020	03.10.2020	Yankee Springs Fall Trail Run Festival (USA)	50km	30	7:27:24 h	*Travers City, I
2760960	2020	03.10.2020	Yankee Springs Fall Trail Run Festival (USA)	50km	30	7:38:30 h	*Mason, I
2760961	2020	03.10.2020	Yankee Springs Fall Trail Run Festival (USA)	50km	30	7:59:53 h	Na

26524 rows × 13 columns

```
In [117... filt_df=df[(df["Event distance/length"].isin(["50km", "50mi"])) & (df["Yea
```

```
In [118... filt_df.head()
```

Out[118]:

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlet clu
2539945	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	3:17:55 h	*Normand Park, W.
2539946	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:02:32 h	*Gold Ba W
2539947	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:07:57 h	*Vashor W.
2539948	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:22:02 h	*Gi Harbor, W
2539949	2020	02.02.2020	West Seattle Beach Run - Winter Edition (USA)	50km	20	4:27:34 h	*Bainbridg Island, W.

In [119... `filt_df.shape`Out[119]: `(26524, 13)`In [120... `#Removing unnecessary (USA) substring from the event name because We filt`In [121... `filt_df["Event name"]=filt_df["Event name"].str.replace("(USA)","")`In [122... `filt_df.head(5)`

Out [122]:

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlet clu
2539945	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55 h	*Normand Park, W.
2539946	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32 h	*Gold Ba W
2539947	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57 h	*Vashor W.
2539948	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02 h	*Gi Harbor, W.
2539949	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34 h	*Bainbridg Island, W.

In [123... *#Adding a new column as Athlete age*In [124... `filt_df["Athlete age"]=(2020-filt_df["Athlete year of birth"])`In [125... `filt_df.head(5)`



Out [125]:

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlet clu
2539945	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55 h	*Normand Park, W.
2539946	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32 h	*Gold Ba W
2539947	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57 h	*Vashor W.
2539948	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02 h	*Gi Harbor, W.
2539949	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34 h	*Bainbridg Island, W.

```
In [126... #Removing "h" letter from Athlete performance column
```

```
In [127... filt_df["Athlete performance"]=filt_df["Athlete performance"].str.replace
```

```
In [128... #drop unnecessary columns:Athlete club, Athlete year of birth, Athlete ag
```

```
In [129... filt_df.drop(["Athlete club","Athlete year of birth","Athlete age categor
```

```
In [130... filt_df.head(5)
```

Out[130]:

	Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlete country
2539945	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55	USA
2539946	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32	USA
2539947	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57	USA
2539948	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02	USA
2539949	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34	USA

In [131... `filt_df.isna().sum()`

```
Out[131]: Year of event          0
Event dates          0
Event name           0
Event distance/length 0
Event number of finishers 0
Athlete performance  0
Athlete country      0
Athlete gender       0
Athlete average speed 0
Athlete ID           0
Athlete age          235
dtype: int64
```

In [132... *#Observing the null values*

```
In [133... #Drop the row which has null values
```

```
In [134... filt_df.dropna(inplace=True)
```

```
In [135... #Check the dataframe whether it has duplicates or not
```

```
In [136... filt_df[filt_df.duplicated()]
```

Out[136]:

Year of event	Event dates	Event name	Event distance/length	Event number of finishers	Athlete performance	Athlete country	Athlete gender	Athlete average speed
---------------------	----------------	---------------	--------------------------	------------------------------------	------------------------	--------------------	-------------------	-----------------------------

```
In [137... #In conclusion, there is no duplicated row in the dataframe.
```

```
In [138... #Now, reset the index
```

```
In [139... filt_df.reset_index(drop=True,inplace=True)
```

```
In [140... filt_df.head()
```

Out [140]:

	Year of event	Event dates	Event name	distance/length	Event number of finishers	Athlete performance	Athlete country	Athlete gender
0	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55	USA	M
1	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32	USA	M
2	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57	USA	M
3	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02	USA	M
4	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34	USA	M

```
In [141... #Convert the data type of Athlete age to integer
filt_df["Athlete age"]=filt_df["Athlete age"].astype(int)
```

```
In [142... #Now, check the last version
```

```
In [143... filt_df.head()
```

Out [143]:

	Year of event	Event dates	Event name	distance/length	Event number of finishers	Athlete performance	Athlete country	Athlete gender
0	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55	USA	M
1	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32	USA	M
2	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57	USA	M
3	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02	USA	M
4	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34	USA	M

In [144...

```
filt_df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 26289 entries, 0 to 26288
Data columns (total 11 columns):
 #   Column                                Non-Null Count  Dtype
---  -
 0   Year of event                        26289 non-null  int64
 1   Event dates                          26289 non-null  object
 2   Event name                          26289 non-null  object
 3   Event distance/length               26289 non-null  object
 4   Event number of finishers           26289 non-null  int64
 5   Athlete performance                 26289 non-null  object
 6   Athlete country                     26289 non-null  object
 7   Athlete gender                      26289 non-null  object
 8   Athlete average speed               26289 non-null  object
 9   Athlete ID                          26289 non-null  int64
10   Athlete age                         26289 non-null  int64
dtypes: int64(4), object(7)
memory usage: 2.2+ MB

```

```
In [145... filt_df.shape
```

```
Out[145]: (26289, 11)
```

```
In [146... #Fixing the data types
```

```
In [147... filt_df["Athlete average speed"]=filt_df["Athlete average speed"].astype(
```

```
In [148... # Need to rename to columns to make them more functional
```

```
In [149... filt_df.rename(columns= {"Year of event": "year",
                                "Event dates": "race_day",
                                "Event name": "race_name",
                                "Event distance/length": "race_distance",
                                "Event number of finishers": "num_finishers",
                                "Athlete performance": "athl_performance",
                                "Athlete country": "athl_country",
                                "Athlete gender": "gender",
                                "Athlete average speed": "athl_avg_speed",
                                "Athlete ID": "athl_id",
                                "Athlete age": "athl_age"}, inplace=True)
```

```
In [150... filt_df.head()
```

Out [150]:

	year	race_day	race_name	race_distance	num_finishers	athl_performance	athl_
0	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	3:17:55	
1	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:02:32	
2	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:07:57	
3	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:22:02	
4	2020	02.02.2020	West Seattle Beach Run - Winter Edition	50km	20	4:27:34	

In [151... `#reorder columns`

```
In [152... df1=filt_df[["race_name",  
              "race_day",  
              "year",  
              "race_distance",  
              "num_finishers",  
              "athl_id",  
              "gender",  
              "athl_age",  
              "athl_country",  
              "athl_performance",  
              "athl_avg_speed"]]
```

In [153... `df1.head()`

Out [153]:

	race_name	race_day	year	race_distance	num_finishers	athl_id	gender	athl_a
0	West Seattle Beach Run - Winter Edition	02.02.2020	2020	50km	20	71287	M	
1	West Seattle Beach Run - Winter Edition	02.02.2020	2020	50km	20	629508	M	
2	West Seattle Beach Run - Winter Edition	02.02.2020	2020	50km	20	64838	M	
3	West Seattle Beach Run - Winter Edition	02.02.2020	2020	50km	20	704450	M	
4	West Seattle Beach Run - Winter Edition	02.02.2020	2020	50km	20	810281	M	

In [154... *#year columns is unnecessary right now because we know that all the races*

In [155... `df1.drop("year", inplace=True, axis=1)`

In [156... `df1.head()`

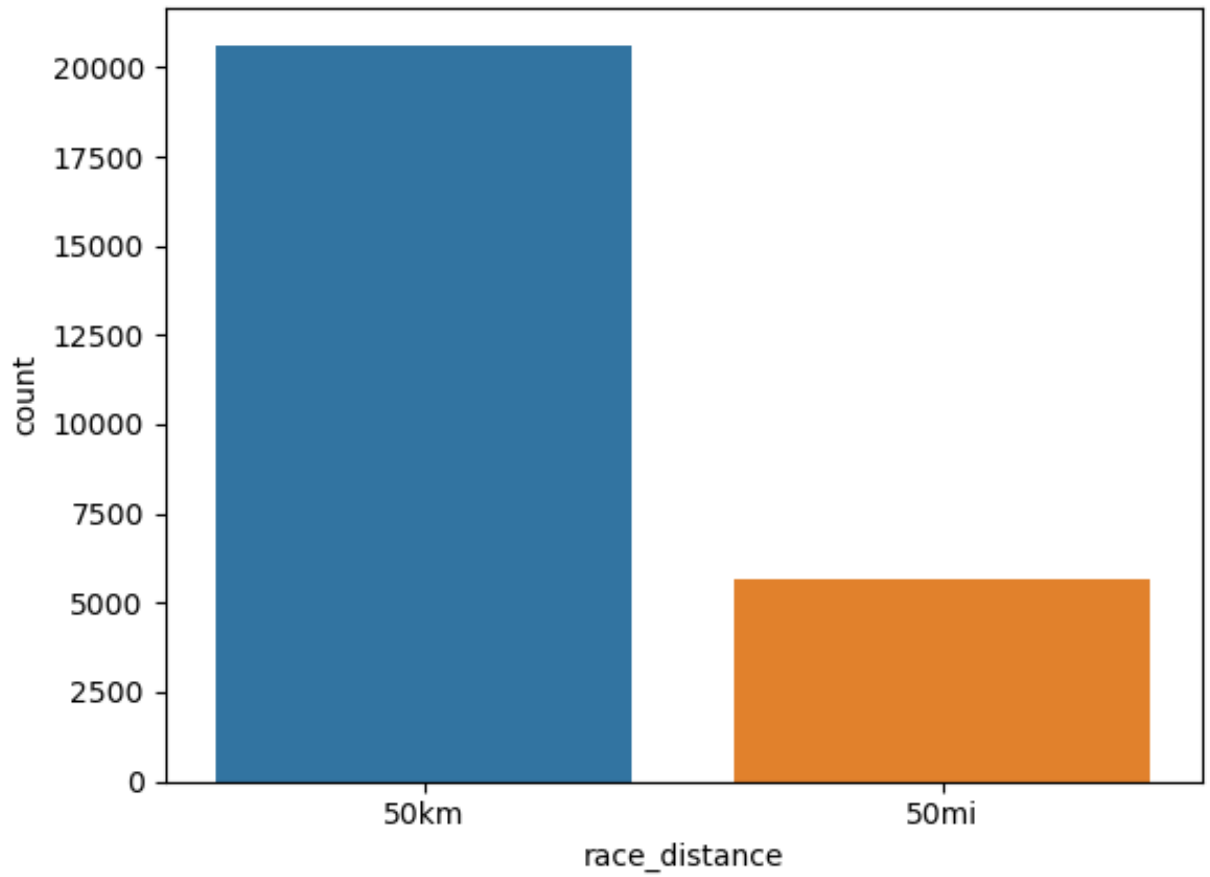


Out [156]:

	race_name	race_day	race_distance	num_finishers	athl_id	gender	athl_age	atl
0	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	71287	M	29	
1	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	629508	M	39	
2	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	64838	M	21	
3	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	704450	M	37	
4	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	810281	M	43	

In [157...

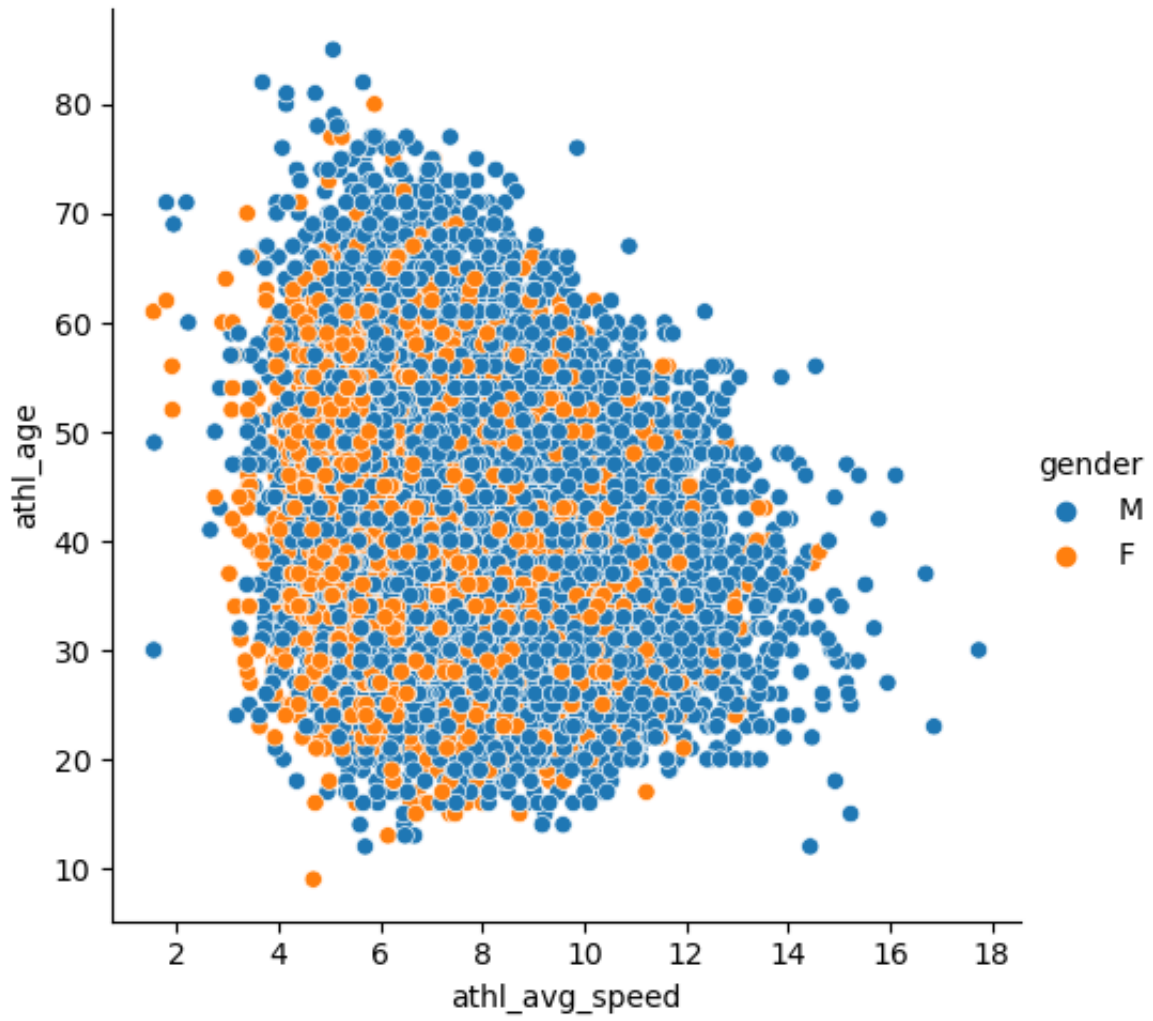
```
sns.countplot(data=df1,x="race_distance");
```



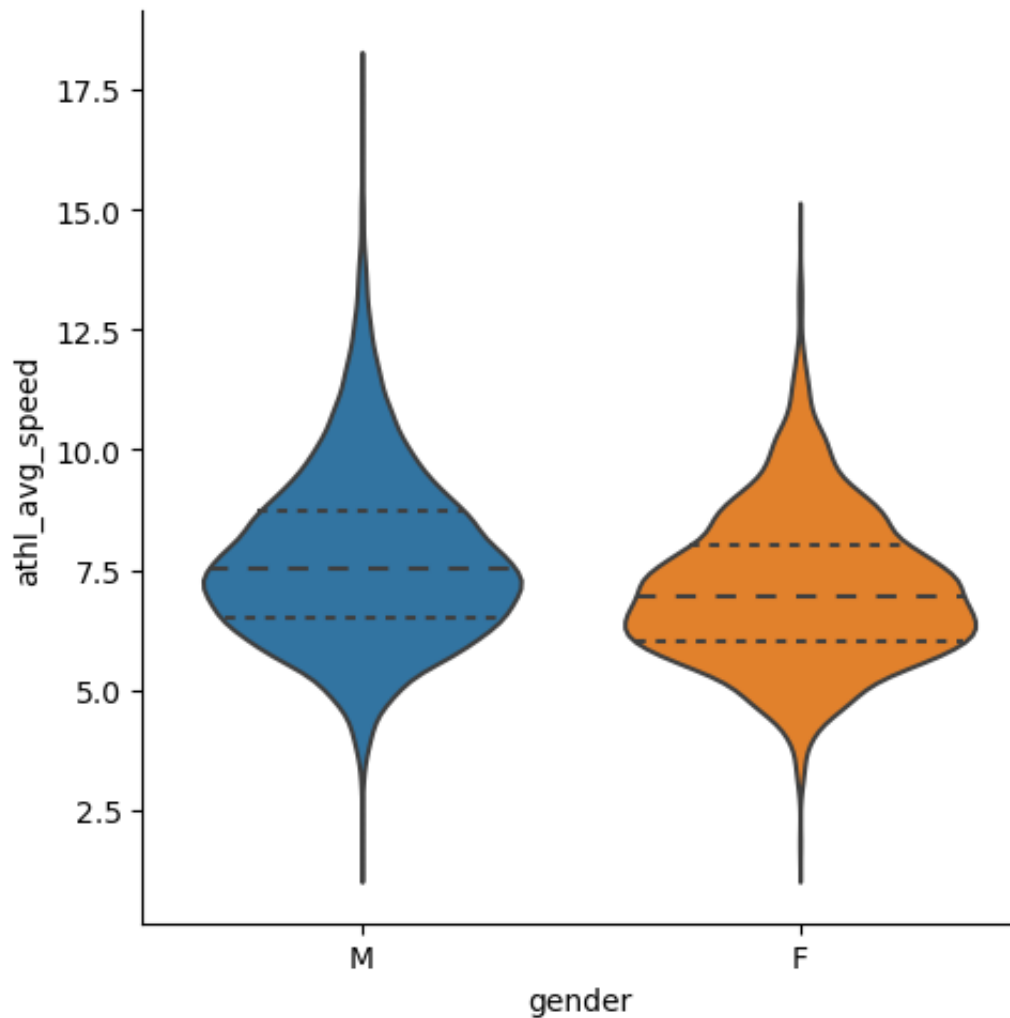
In [158... *#Question1: Difference in speed for the 50k and 50mi male to female*

In [159... `df_50km=df1[df1["race_distance"]=="50km"]`

In [160... `sns.relplot(data=df_50km,x="athl_avg_speed",y="athl_age",hue="gender");`



```
In [161... sns.catplot(data=df_50km,y="athl_avg_speed",x="gender",kind="violin",inne
```



```
In [162...] df_50km.groupby("gender")["athl_avg_speed"].agg([("mean", np.mean), ("med
```

```
Out[162]:
```

	mean	median	max_speed	min_speed
--	------	--------	-----------	-----------

gender	mean	median	max_speed	min_speed
--------	------	--------	-----------	-----------

F	7.092015	6.927	14.614	1.541
---	----------	-------	--------	-------

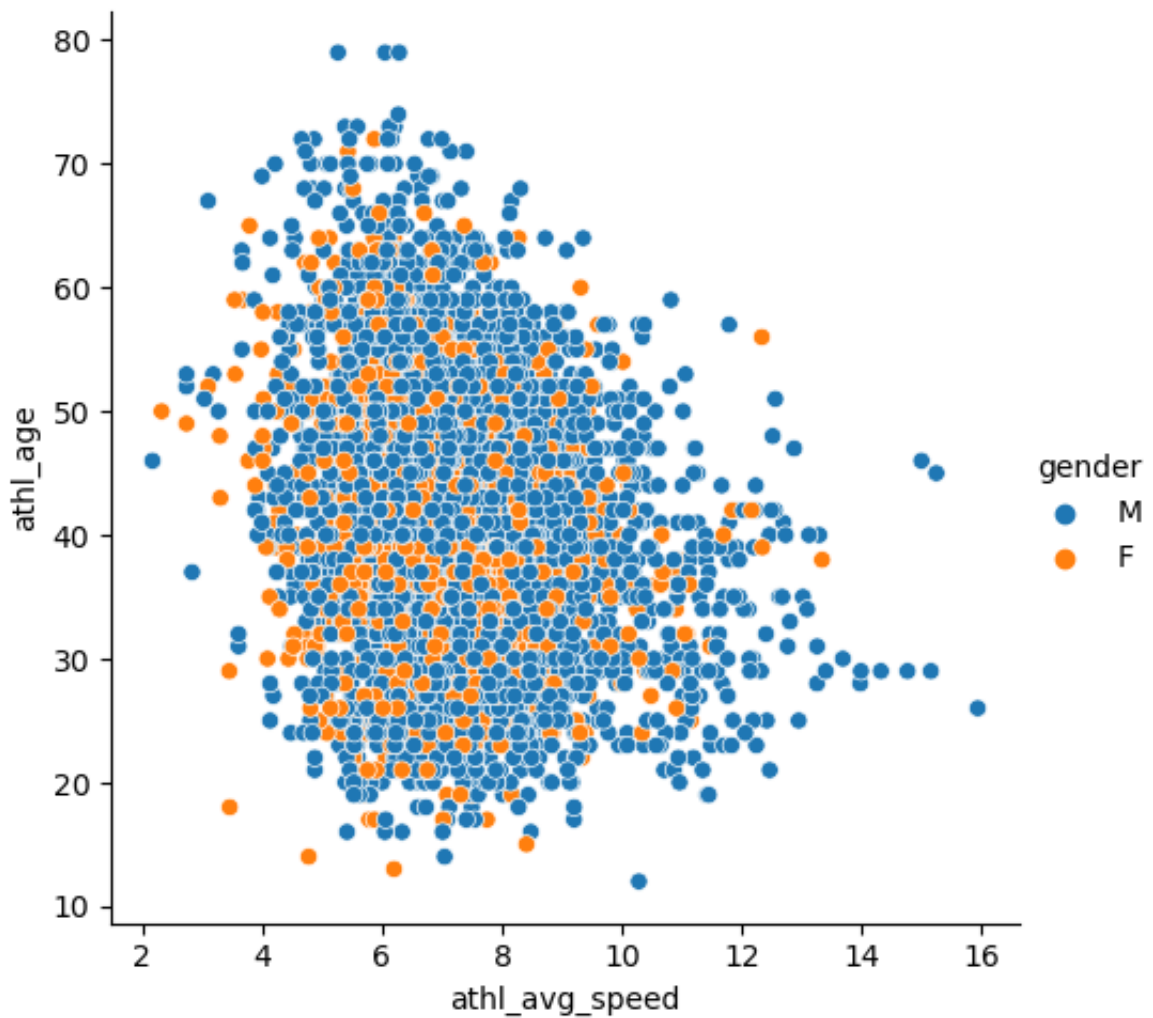
M	7.743376	7.508	17.746	1.547
---	----------	-------	--------	-------

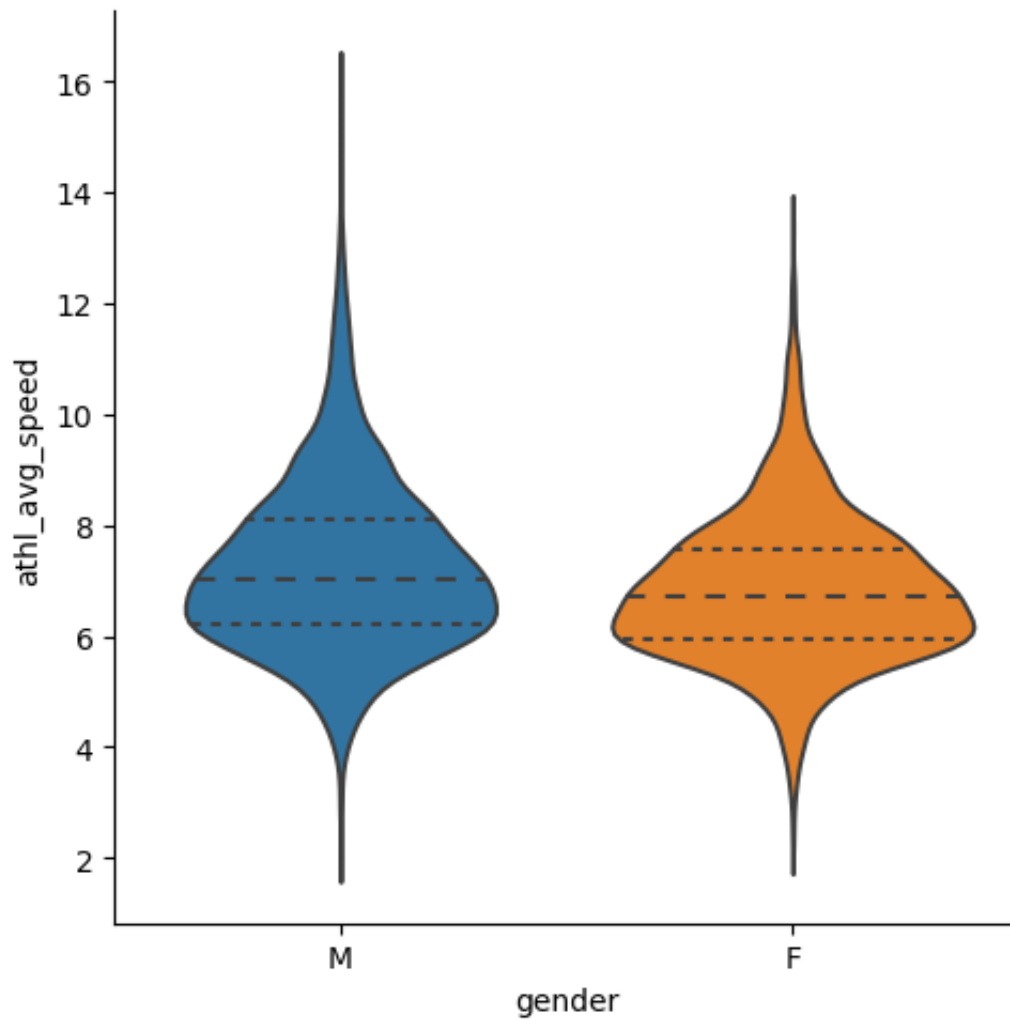
```
In [163...] df_50mi=df1[df1["race_distance"]=="50mi"]
```

```
In [164...] df_50mi.head()
```

Out [164]:

	race_name	race_day	race_distance	num_finishers	athl_id	gender	athl_age
433	Elephant Mountain 50 Mile	01.02.2020	50mi	10	86674	M	33
434	Elephant Mountain 50 Mile	01.02.2020	50mi	10	53268	M	35
435	Elephant Mountain 50 Mile	01.02.2020	50mi	10	778567	M	32
436	Elephant Mountain 50 Mile	01.02.2020	50mi	10	209242	M	41
437	Elephant Mountain 50 Mile	01.02.2020	50mi	10	810742	M	23

In [165... `sns.relplot(data=df_50mi,x="athl_avg_speed",y="athl_age",hue="gender");`In [166... `sns.catplot(data=df_50mi,y="athl_avg_speed",x="gender",kind="violin",inner`



```
In [167...] df_50mi.groupby("gender")["athl_avg_speed"].agg([("mean", np.mean), ("med
```

```
Out[167]:
```

	mean	median	max_speed	min_speed
--	------	--------	-----------	-----------

gender				
F	6.830764	6.6940	13.335	2.323
M	7.249766	7.0045	15.930	2.170

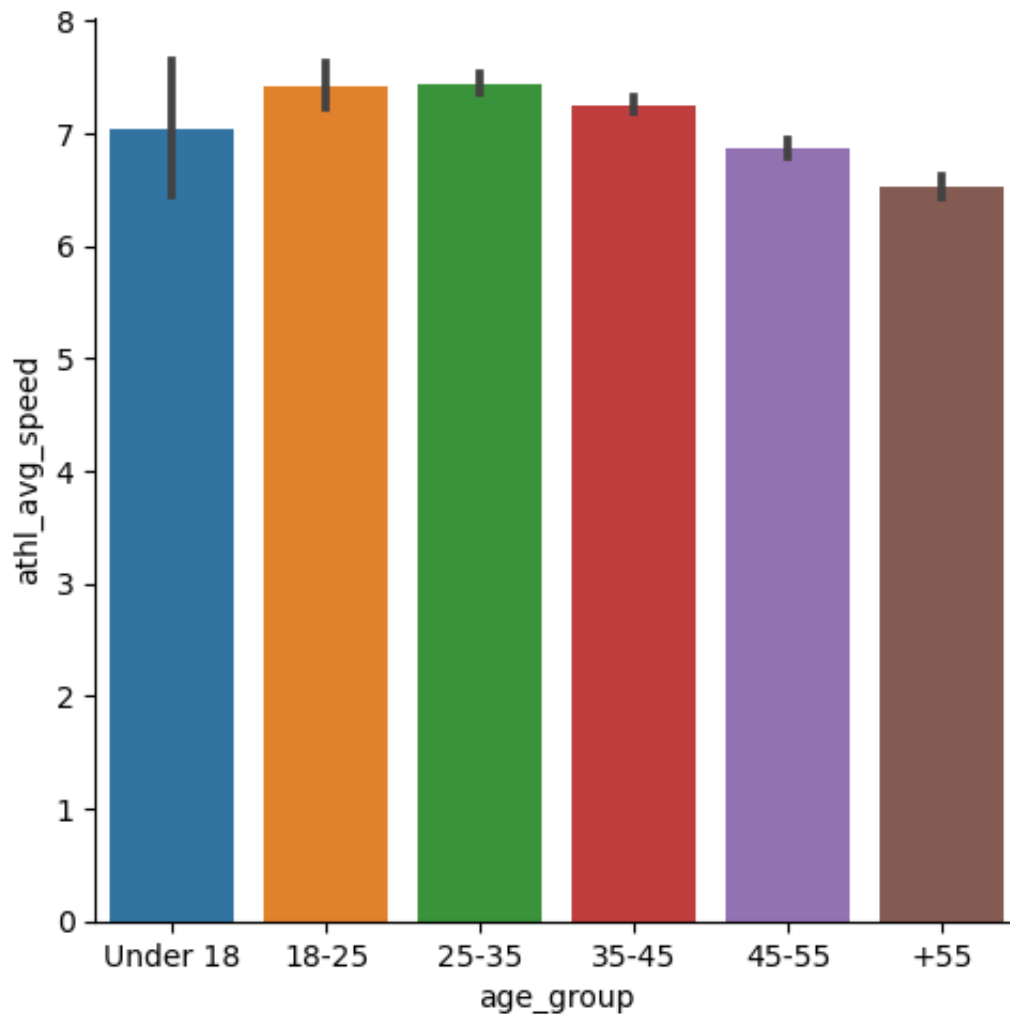
```
In [168...] #What age group are the best in the 50mi and 50 km race ?
```

```
In [169...] df_50mi["athl_age"].sort_values()
```

```
Out[169]: 5756      12
          7607      13
          6784      14
          22096     14
          25222     15
          ..
          25457     74
          23623     79
          15486     79
          21709     79
          23028     79
          Name: athl_age, Length: 5657, dtype: int64
```

```
In [170...] df_50mi["age_group"]=df_50mi["athl_age"].apply(lambda x: "Under 18" if x
                                                             "18-25" if 18 <=
                                                             "25-35" if 25 <=
                                                             "35-45" if 35 <=
                                                             "45-55" if 45 <=
                                                             "+55")
```

```
In [171...] sns.catplot(data=df_50mi,x="age_group",y="athl_avg_speed",kind="bar",orde
```



```
In [172...] df_50mi.groupby("age_group")["athl_avg_speed"].mean().reset_index(name="m
```

```
Out[172]:
```

	age_group	mean
2	25-35	7.441253
1	18-25	7.424739
3	35-45	7.255109
5	Under 18	7.036316
4	45-55	6.872478
0	+55	6.518624

```
In [173...] df_50km["athl_age"].sort_values()
```

```
Out[173]:
```

24707	9
7100	12
24273	12
12515	13
14957	13
	..
3981	81
12773	81
13531	82
6991	82
808	85

Name: athl\_age, Length: 20632, dtype: int64

```
In [174...] df_50km["age_group"] = df_50km["athl_age"].apply(lambda x: "Under 18" if x
                                                                "18-25" if 18 <=
                                                                "25-35" if 25 <=
                                                                "35-45" if 35 <=
                                                                "45-55" if 45 <=
                                                                "+55")
```

```
In [175...] df_50km.head()
```

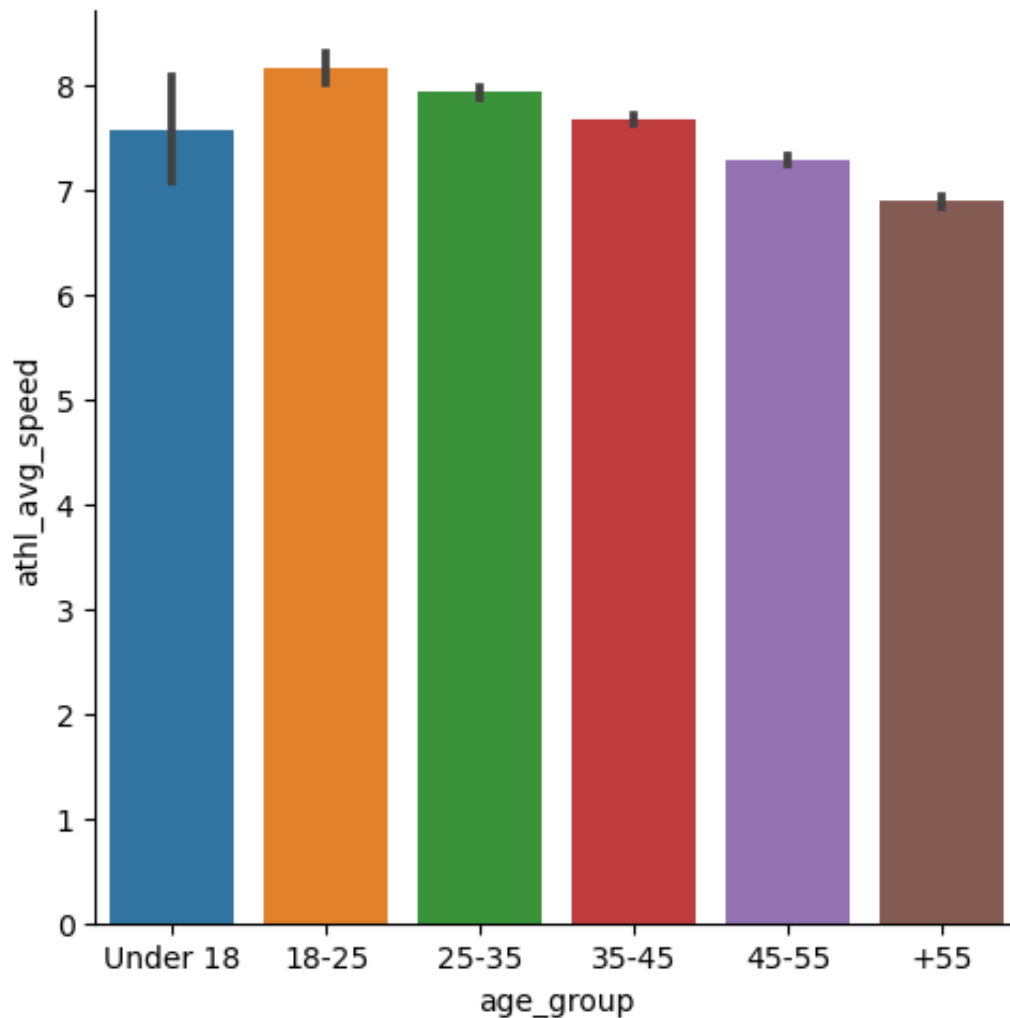


Out [175]:

	race_name	race_day	race_distance	num_finishers	athl_id	gender	athl_age	atl
0	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	71287	M	29	
1	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	629508	M	39	
2	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	64838	M	21	
3	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	704450	M	37	
4	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	810281	M	43	

In [176...

```
sns.catplot(data=df_50km,x="age_group",y="athl_avg_speed",kind="bar",orde
```



```
In [177...] df_50km.groupby("age_group")["athl_avg_speed"].mean().reset_index(name="mean")
```

```
Out[177]:
```

	age_group	mean
1	18-25	8.149263
2	25-35	7.922358
3	35-45	7.657472
5	Under 18	7.556508
4	45-55	7.270246
0	+55	6.885121

```
In [178...] df1["age_group"] = df1["athl_age"].apply(lambda x: "Under 18" if x < 18 else  
                                                    "18-25" if 18 <= x < 25 else  
                                                    "25-35" if 25 <= x < 35 else  
                                                    "35-45" if 35 <= x < 45 else  
                                                    "45-55" if 45 <= x < 55 else  
                                                    "+55")
```

```
In [179...] df1.head()
```

Out [179]:

	race_name	race_day	race_distance	num_finishers	athl_id	gender	athl_age	atl
0	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	71287	M	29	
1	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	629508	M	39	
2	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	64838	M	21	
3	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	704450	M	37	
4	West Seattle Beach Run - Winter Edition	02.02.2020	50km	20	810281	M	43	

In [180... *#Fixing the dates*

In [181... `df1[df1["race_day"].str.contains(r"\.\.")]`

Out [181]:

race_name	race_day	race_distance	num_finishers	athl_id	gender	athl_age	athl_c
-----------	----------	---------------	---------------	---------	--------	----------	--------

In [182... `df1.loc[df1["race_day"].str.contains(r"\.\.", na=False), "race_day"] = df`

In [183... `df1["race_day"].value_counts()`

```
Out[183]: race_day
07.03.2020      1660
25.01.2020      1167
21.11.2020      1165
11.01.2020      1138
29.02.2020      1052
...
28.-29.11.2020    11
05.07.2020         9
12.03.2020         5
05.-07.09.2020     4
11.03.2020         3
Name: count, Length: 108, dtype: int64
```

```
In [184...] df1.loc[df1["race_day"].str.contains(r"\.\-", na=False), "race_day"]=df1[
```

```
In [185...] df1["race_day"].value_counts()
```

```
Out[185]: race_day
07.03.2020      1660
25.01.2020      1167
21.11.2020      1165
11.01.2020      1138
29.02.2020      1052
...
29.11.2020       11
05.07.2020        9
12.03.2020        5
07.09.2020        4
11.03.2020        3
Name: count, Length: 95, dtype: int64
```

```
In [186...] df1["race_month"]=df1["race_day"].str.split(".").str.get(1).astype(int)
```

```
In [187...] df1["race_season"]=df1["race_month"].apply(lambda x: "Spring" if 2<x<=5 e
                                                    "Summer" if 5<x<=8 e
                                                    "Fall" if 8<x<=11
                                                    "Winter")
```

```
In [188...] df1.drop("race_month",axis=1,inplace=True)
```

```
In [189...] df1.groupby(["race_season","age_group"])["athl_avg_speed"].mean()
```

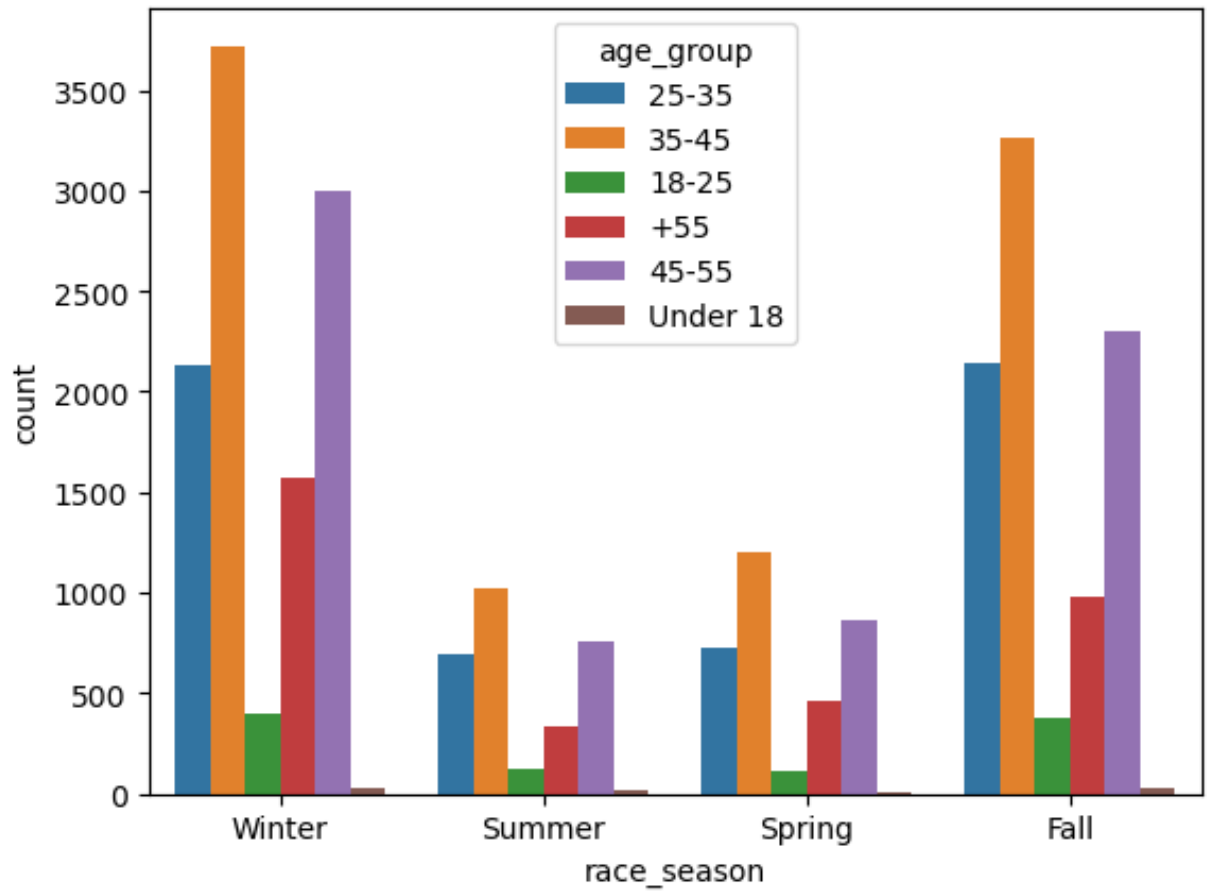
```
Out[189]: race_season age_group
          Fall      +55      6.668663
               18-25      7.798949
               25-35      7.776901
               35-45      7.481156
               45-55      7.054447
          Under 18      7.228088
          Spring +55      6.983531
               18-25      8.440274
               25-35      7.951876
               35-45      7.912074
               45-55      7.466796
          Under 18      9.746375
          Summer +55      6.304400
               18-25      7.167944
               25-35      7.099191
               35-45      6.967286
               45-55      6.567397
          Under 18      6.692154
          Winter +55      6.974438
               18-25      8.230388
               25-35      8.025848
               35-45      7.696232
               45-55      7.372479
          Under 18      7.384103
          Name: athl_avg_speed, dtype: float64
```

```
In [190...] df1.groupby("race_season")["athl_avg_speed"].agg(["mean", "count"]).sort_v
```

```
Out[190]:
```

	mean	count
race_season		
Spring	7.703542	3385
Winter	7.585842	10853
Fall	7.367121	9112
Summer	6.826808	2939

```
In [191...] sns.countplot(data=df1, x="race_season", hue="age_group");
```



In [ ]: