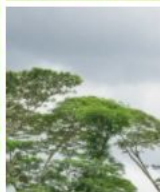


Cycosports Race Analysis

Analysis of a publicly available race timings dataset.

Eric Lim

Singapore's leading organiser of off-road cycling and running events



Singapore's Most Inspiring Trail Runners – Part 2



BY SAMANTHA KHOO ON JAN 21, 2020

Embrace the trail so that it becomes easier to overcome.

runsociety.com



Jungle Cross 2021 Trail Run Series Race 2

e.g. 7:16 AM

PI	overall	Name	Club	Start	1stLap	2ndLap	Time
10km - OPEN 13+ YRS							
Male							
Open - Male							
1.	1.	Malachy Kirwan (316)		7:16:17.70	21:09.20	21:55.00	43:04.20
2.	2.	William Petty (267)	Coached	7:16:18.70	21:43.80	22:00.40	43:44.20
3.	4.	Chris Timms (251)	Dulwich Runners	7:16:58.30	22:15.30	23:27.00	45:42.30
4.	6.	Benoit Besnier (320)	COS Coaching	7:16:17.80	23:32.70	24:02.80	47:35.50
5.	7.	Daniel Rose (311)	Coached Fitness	7:16:59.20	22:55.10	24:41.30	47:36.40
6.	10.	Stanislav Miroshnichenko		7:18:44.00	24:22.60	24:23.00	48:45.60
7.	12.	Ian Stewart (253)	Dulwich Runners	7:17:55.80	23:27.30	25:37.30	49:04.60
8.	14.	Tycen Bundgaard (297)		7:18:43.60	25:01.40	24:47.10	49:48.50
9.	15.	Samuel Iii Belandres	Filipino Runners	7:17:55.20	23:38.40	26:18.70	49:57.10
10.	16.	Anish Jha (299)		7:17:55.70	25:28.60	25:40.90	51:09.50
11.	17.	Jonathan Eudeline (315)		7:18:44.80	25:32.60	26:09.20	51:41.80
12.	18.	Adrien Humbert (326)	Shelfordians	7:19:35.20	24:59.30	26:56.80	51:56.10
13.	19.	Ludovic Guyonvarch		7:19:35.80	25:54.60	26:59.00	52:53.60
14.	21.	Hamish Livingstone (330)		7:22:45.20	26:13.00	27:51.50	54:04.50
15.	22.	Finlay Reid (312)		7:17:55.10	25:20.00	29:18.10	54:38.10
16.	23.	Oscar Fourie (314)		8:26:19.40	26:57.20	27:42.70	54:39.90

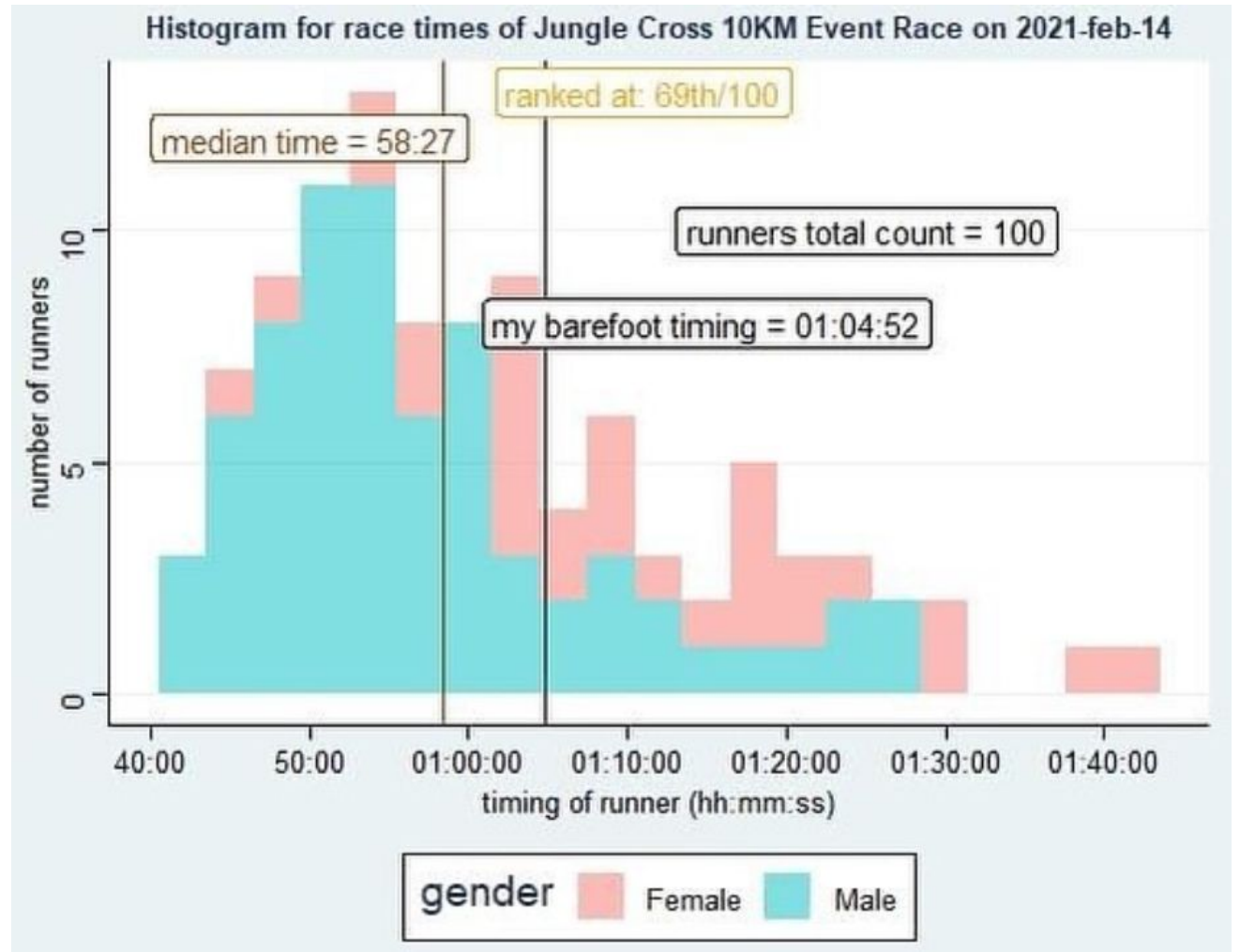
Sports analytics

How can we leverage on data to improve performance?

“Sports analytics are a collection of relevant, historical, statistics that can provide a competitive advantage to a team or individual.”

- Sports Analytics, Wikipedia

Sample Deliverable



The problem

Who was I?

An aspiring data scientist/analyst wanting to take up the challenge of Exploratory Data Analysis using Python.

What was the problem?

My friend needed to obtain useful insights about his performance in his recent trail run race.

This would be in the form of clear and effective visualisations.

Who was the audience?

My friend, a trail runner, coding primarily in R.

Thus, explanations should preferably be code-free.



Data Cleaning

Data Exploration

Concluding Insights

Conversion to .csv



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API

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Working with the data

PI	overall	Name	Club	Start	1stLap	2ndLap	Time
10km - OPEN 13+ YRS							
Male							
Open - Male							
1.	1.	Malachy Kirwan (316)		7:16:17.70	21:09.20	21:55.00	43:04.20
2.	2.	William Petty (267)	Coached	7:16:18.70	21:43.80	22:00.40	43:44.20
3.	4.	Chris Timms (251)	Dulwich Runners	7:16:58.30	22:15.30	23:27.00	45:42.30

?

	PI	overall	Name	Club	Start	1stLap	2ndLap	Time
0	10km - OPEN 13+ YRS	NaN	NaN	NaN	NaN	NaN	NaN	NaN
1	Male	NaN	NaN	NaN	NaN	NaN	NaN	NaN
2	Open - Male	NaN	NaN	NaN	NaN	NaN	NaN	NaN
3	1.	1.	Malachy Kirwan (316)	NaN	7:16:17.70	21:09.20	21:55.00	43:04.20
4	2.	2.	William Petty (267)	Coached	7:16:18.70	21:43.80	22:00.40	43:44.20

category_rank column

● Column renaming

category_rank	event_rank	name	club	start	lap_1	lap_2	time
---------------	------------	------	------	-------	-------	-------	------

	category_rank
0	10km - OPEN 13+ YRS
1	Male
2	Open - Male
3	1.
4	2.

- Distance data (10KM)
- Age data (13+ years)
- Event data (Open)
- Gender (Male)
- Ranking data

Distance, Event and Age

	category_rank
0	10km - OPEN 13+ YRS
91	10km - Masters (40+)
142	3km Adventure Race (7y +)

distance	event	age
10km	Open	13+
10km	Open	13+
10km	Open	13+
10km	Open	13+
10km	Open	13+

10km - OPEN 13+ YRS

NaN

NaN

10km - Masters (40+)

NaN

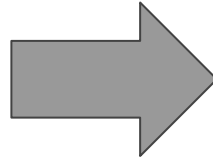
NaN

"10km - Open - 13+"
= "10km - Masters - 40+"
"3km - Adventure Race - 7+"

- Copied the column
- Changed all rows without "km" to a null value (NaN)
- Forward-filling: Using any valid values from above to overwrite null values going down the column
- Changed the text wording
- Split the column using dash (-) as separator
- Named new columns

Gender and Category

	PI
0	10km - OPEN 13+ YRS
1	Male
2	Open - Male
3	1.
4	2.



gender	category
Male	Male
Male	Open
Male	Open
Male	Open
Male	Open

Cleaning up

	category_rank	event_rank	name	club	start	lap_1	lap_2	time
1	Male	NaN	NaN	NaN	NaN	NaN	NaN	NaN
2	Open - Male	NaN	NaN	NaN	NaN	NaN	NaN	NaN
3	1.	1.	Malachy Kirwan (316)	NaN	7:16:17.70	21:09.20	21:55.00	43:04.20
4	2.	2.	William Petty (267)	Coached	7:16:18.70	21:43.80	22:00.40	43:44.20
5	3.	4.	Chris Timms (251)	Dulwich Runners	7:16:58.30	22:15.30	23:27.00	45:42.30

- Simply remove the rows with no time

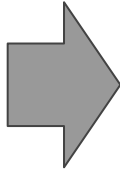
More cleaning up

	category_rank	event_rank	name	club	start	lap_1	lap_2	time
50	8.	38.	Jason Yai (288)	NaN	8:28:49.70	30:36.60	31:39.60	1:02:16.20
51	NaN	NaN	Jungle Cross 2021 Trail Run Series Race 2 & 20...	NaN	NaN	NaN	NaN	1
52	Jungle Cross 2021 Trail Run Series Race 2	NaN	NaN	NaN	NaN	NaN	NaN	NaN
53	PI	overall	Name	Club	Start	1stLap	2ndLap	Time
54	9.	44.	Lee Victor (290)	NaN	8:28:49.40	32:04.70	32:50.10	1:04:54.80

	category_rank	event_rank	name	club	start	lap_1	lap_2	time
215	Under 14	NaN	NaN	NaN	NaN	NaN	NaN	NaN
216	DNS DNS	NaN	Hanna Croissant (426)	NaN	NaN	NaN	NaN	NaN
217	Open	NaN	NaN	NaN	NaN	NaN	NaN	NaN
218	DNS DNS	NaN	Gabriella Faure (417)	NaN	NaN	NaN	NaN	NaN
219	NaN	NaN	Jungle Cross 2021 Trail Run Series Race 2 & 20...	NaN	NaN	NaN	NaN	5

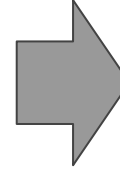
Club column and Bib Number column

club
NaN
Dulwich Runners
NaN
Filipino Runners
NaN



club
None
Coached
Dulwich Runners
COS Coaching
Coached Fitness

name
Malachy Kirwan (316)
William Petty (267)
Chris Timms (251)
Benoit Besnier (320)
Daniel Rose (311)



bib_number
None
253
297
None
299

Timedelta object

time
56:41.50
57:02.50
1:01:10.90
1:05:09.50
1:05:40.70

- Some were in MM:SS and some were in H:MM:SS
- Could not convert to timedelta object (for analysis)
- Want everything in HH:MM:SS
- We need to add extra '00:'s to those below an hour
- We need to add extra '0:'s to those one hour and above

Solutions (to differentiate them):

- Use number of characters
- Use number of semicolons
- Use Regex



Cleaned data

category_rank	event_rank	name	club	start	lap_1	lap_2	time	distance	event	age	gender	category	bib_number
1	1	Malachy Kirwan	None	2021-04-04 07:16:17.700	00:21:09.20	00:21:55.00	00:43:04.20	10km	Open	13+	Male	Open	316
2	2	William Petty	Coached	2021-04-04 07:16:18.700	00:21:43.80	00:22:00.40	00:43:44.20	10km	Open	13+	Male	Open	267
3	4	Chris Timms	Dulwich Runners	2021-04-04 07:16:58.300	00:22:15.30	00:23:27.00	00:45:42.30	10km	Open	13+	Male	Open	251
4	6	Benoit Besnier	COS Coaching	2021-04-04 07:16:17.800	00:23:32.70	00:24:02.80	00:47:35.50	10km	Open	13+	Male	Open	320
5	7	Daniel Rose	Coached Fitness	2021-04-04 07:16:59.200	00:22:55.10	00:24:41.30	00:47:36.40	10km	Open	13+	Male	Open	311

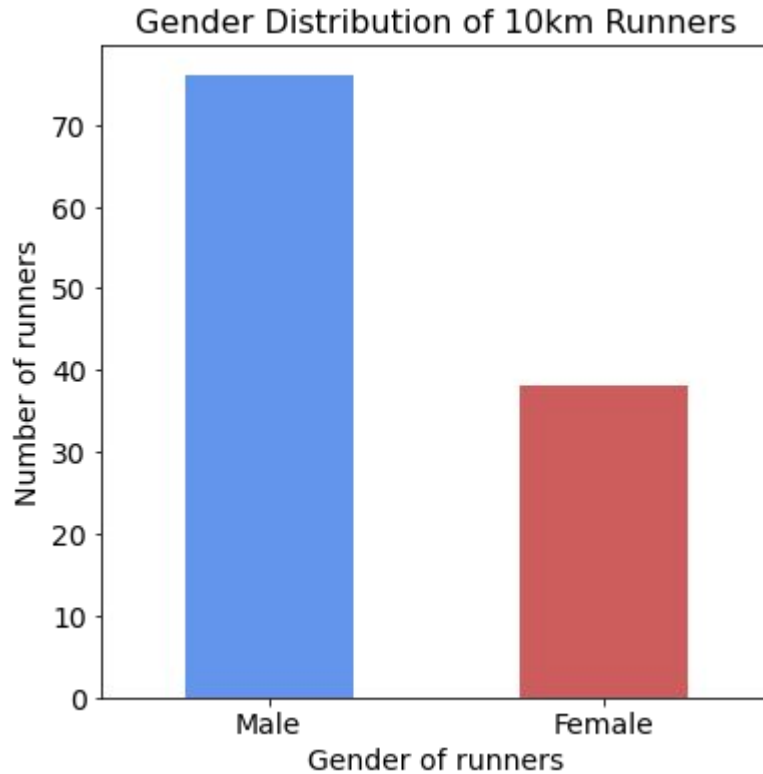


Data Cleaning

Data Exploration

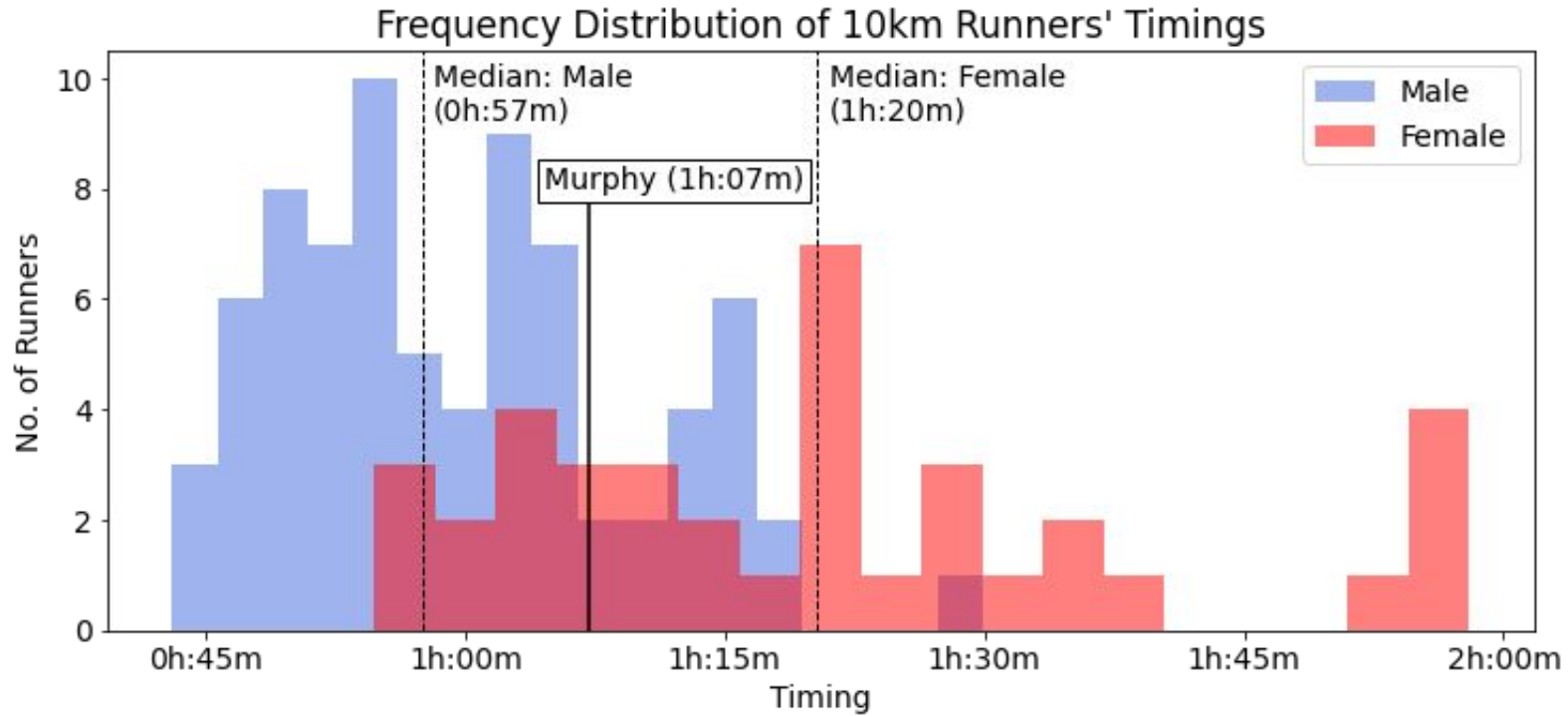
Concluding Insights

Gender

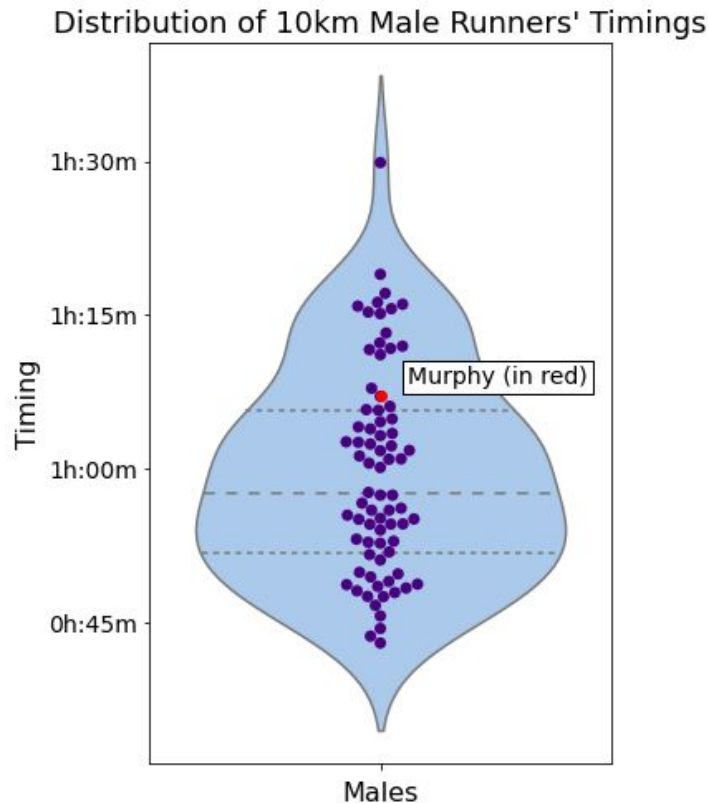


- Only 10KM runners were analysed
- 114 runners in data

Visualising the distribution

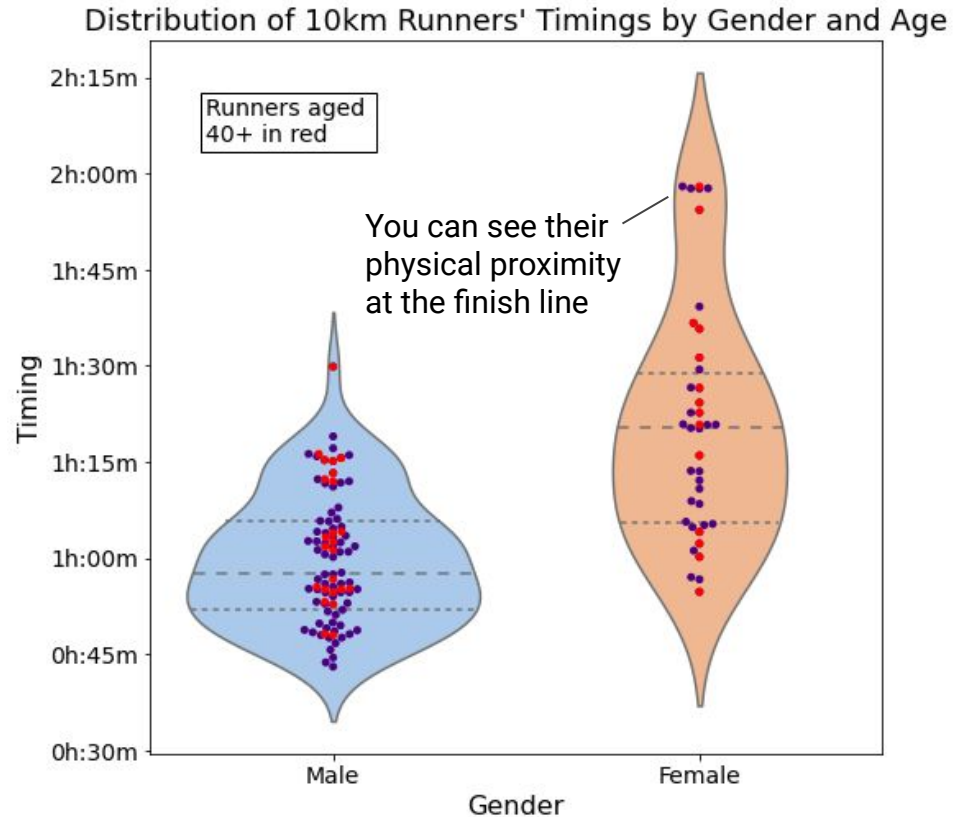


Highlighting an individual

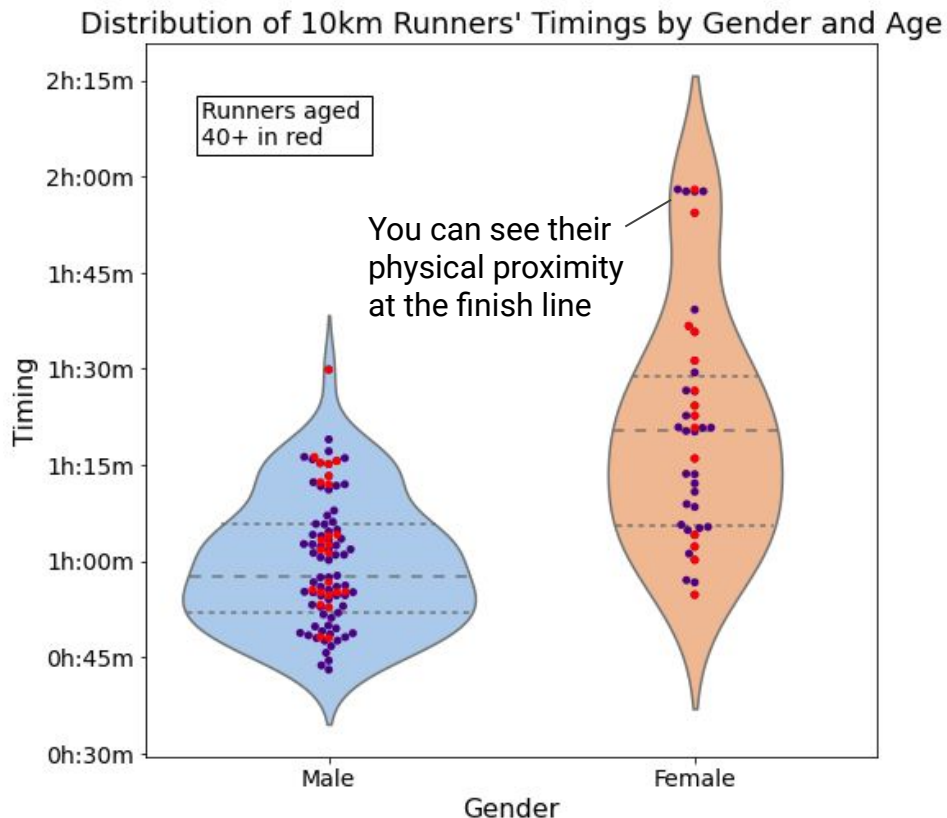


- Swarm plot overlaid on a violin plot
- Dotted lines are quartiles
- Now we can see that the timing is behind the 75th percentile

Gender and Age

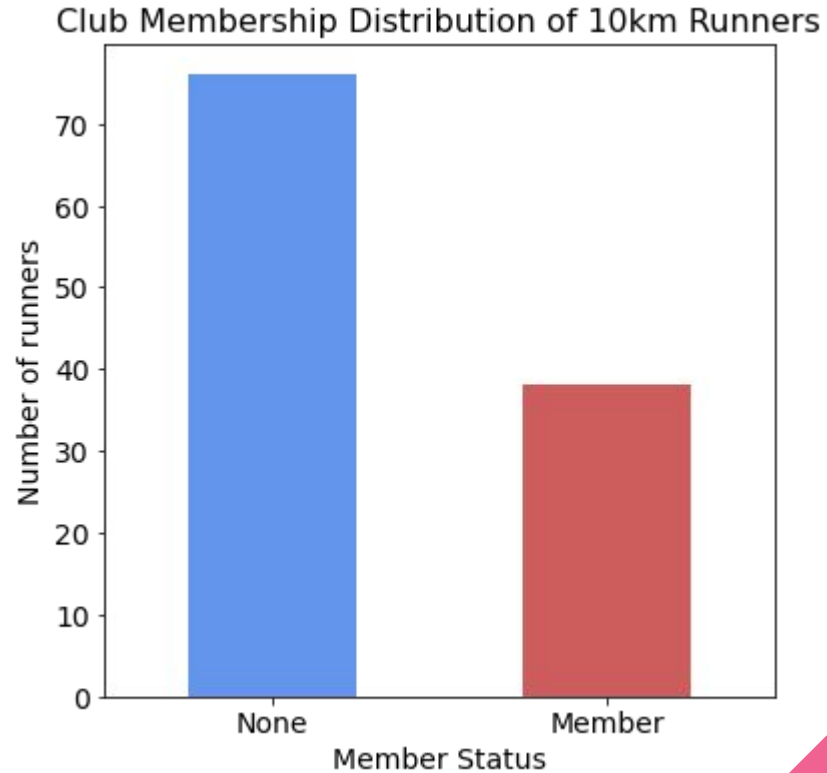


Gender and Age



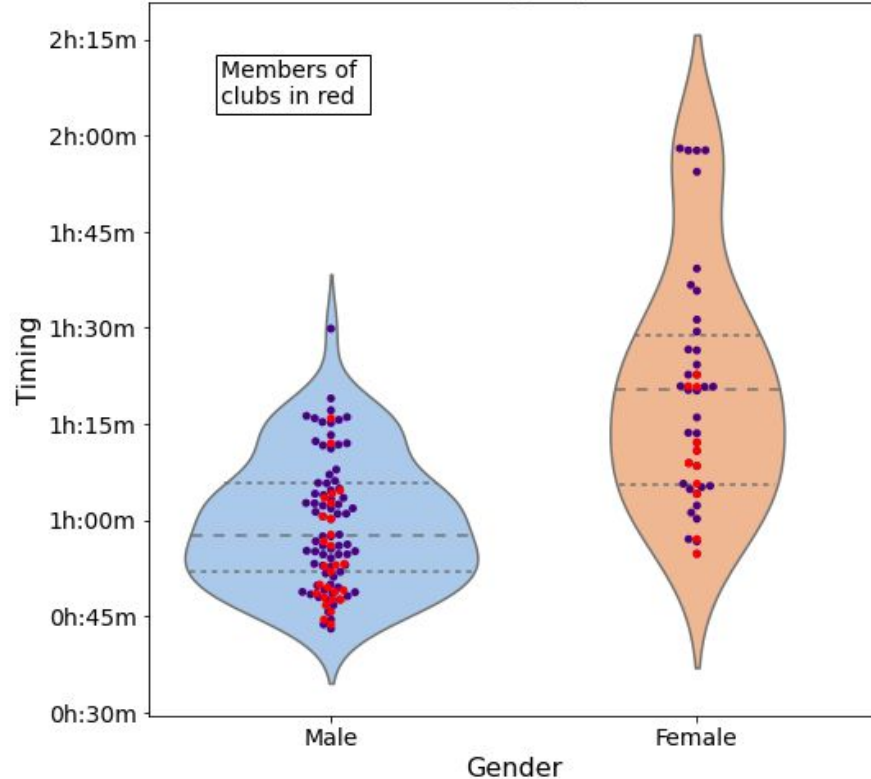
- Median for males 40+: 1h:02m
- Median for males 13+: 0h:56m
- Median for females 40+: 1h:23m
- Median for females 13+: 1h:13m

Club Membership



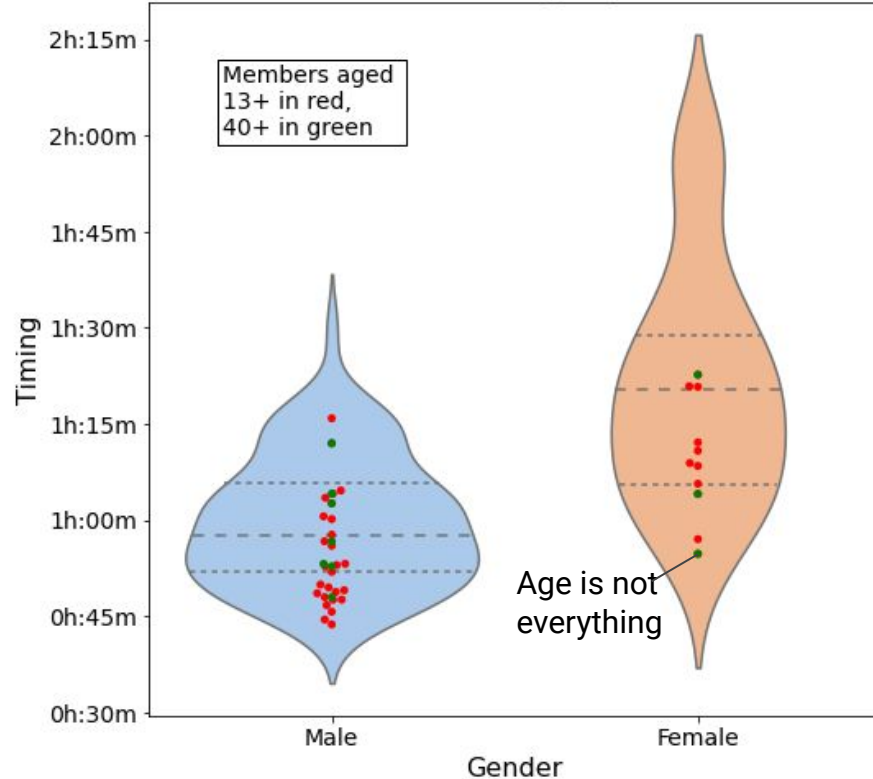
Gender and Club Membership

Distribution of 10km Runners' Timings by Gender and Club Membership

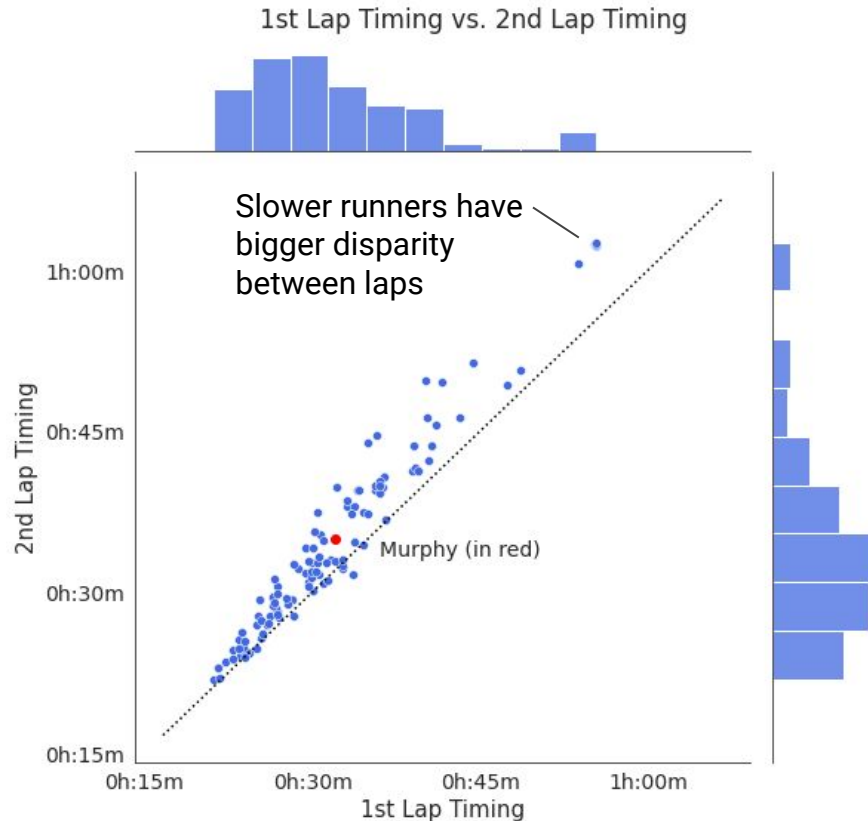


Gender and Age of Club Members only

Distribution of 10km Runners' Timings by Gender for Club Members



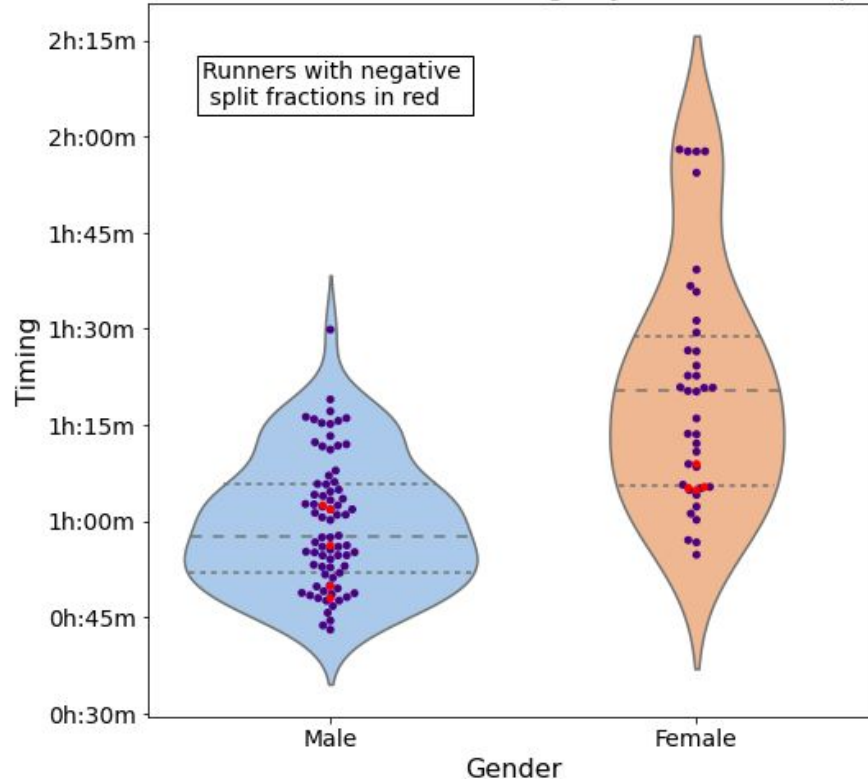
Race Split (1st Lap vs. 2nd Lap)



- Normal to take more time for 2nd lap
- 9 out of 114 runners ran 2nd lap faster
- This is 7.9% of runners

Gender and Race Split

Distribution of 10km Runners' Timings by Gender and Split Fraction



Split Fraction =
 $1 - (1st\ Lap)/(2nd\ Lap)$



Data Cleaning

Data Exploration

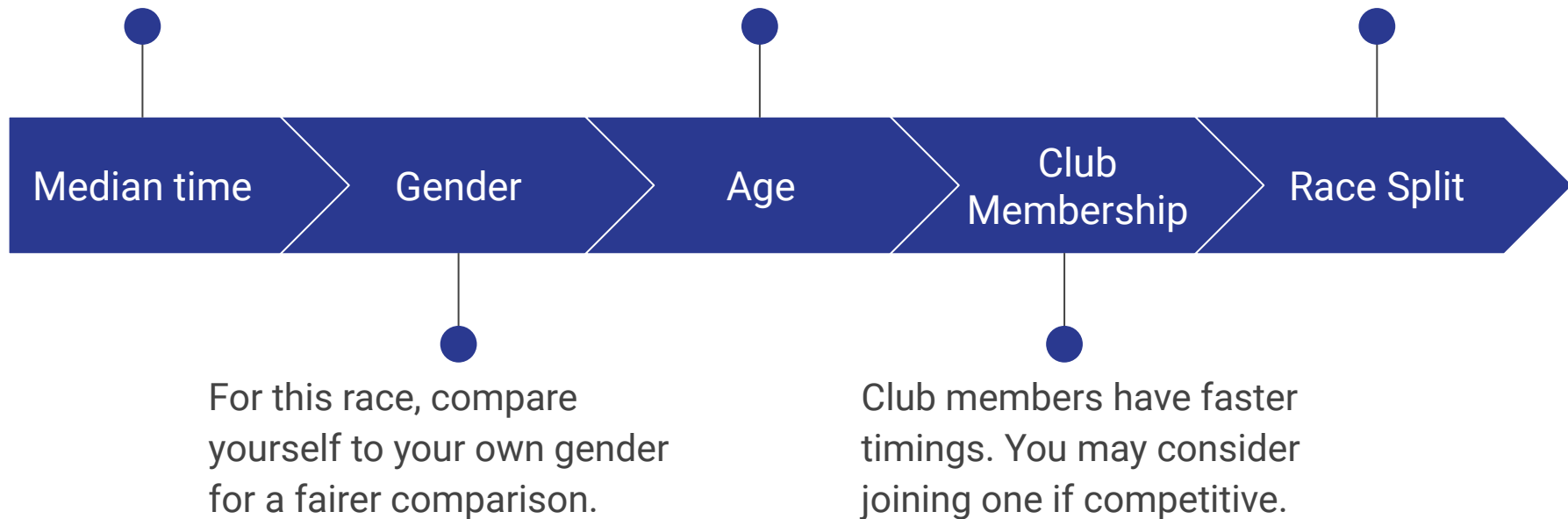
Concluding Insights

Personalised Analytics Example

You are behind the median time for your gender & age group by 11 minutes.

Younger runners are generally expected to be faster, but there can be exceptions.

You take longer to run your second lap, but this is normal.



Key Takeaways from Project

Value of EDA

**Exploratory Data
Analysis already reveals
key insights**

Scouted online for ideas
on race analysis with
Python

Swarm plots

Data Science Problems

They are all around you

Talk to the people around
you

Different people have
different receptivity/
resistance

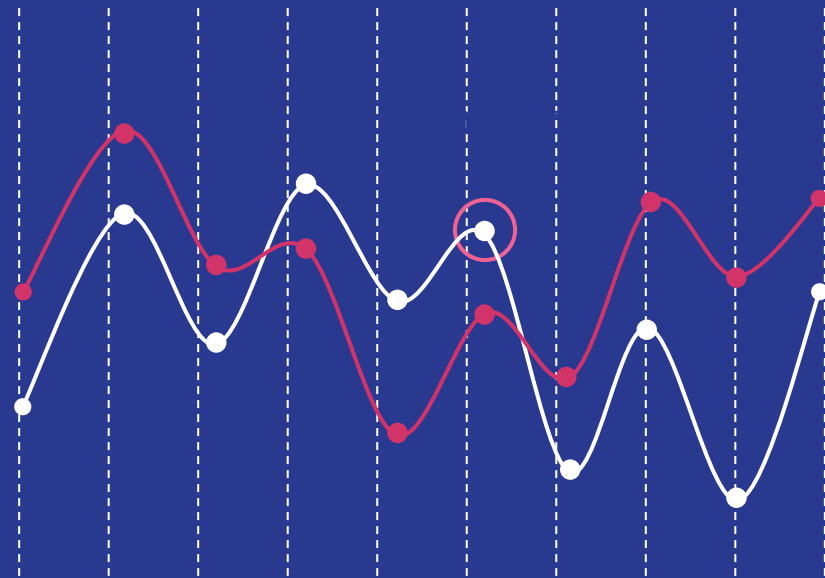
Project-based learning

**Just need to go through
the fire initially**

How many times do you
have to relearn Pandas
(for e.g.) in your life?

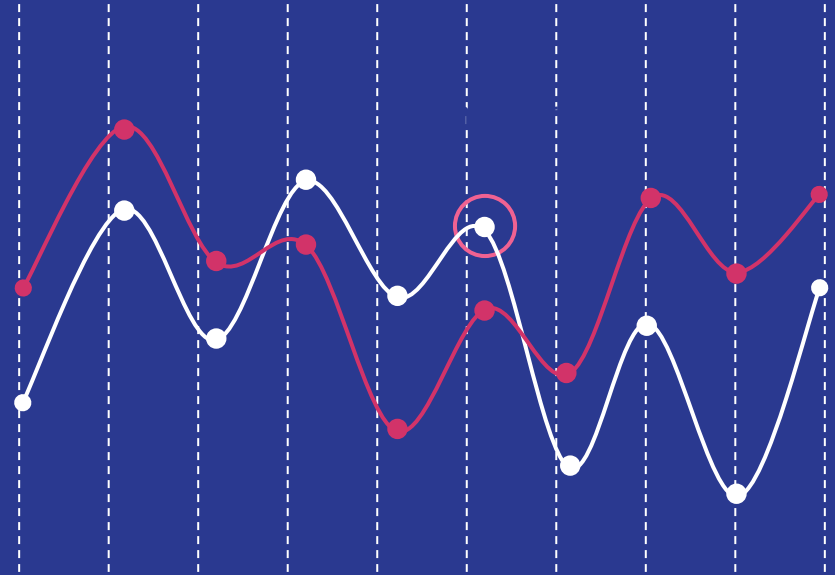
It will become easier

Thank you!

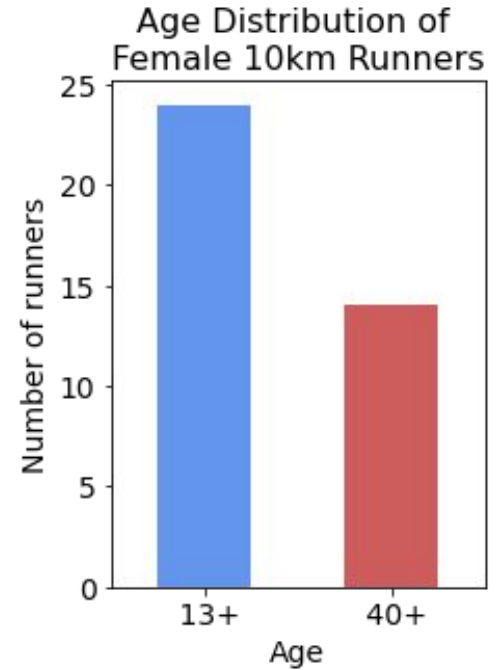
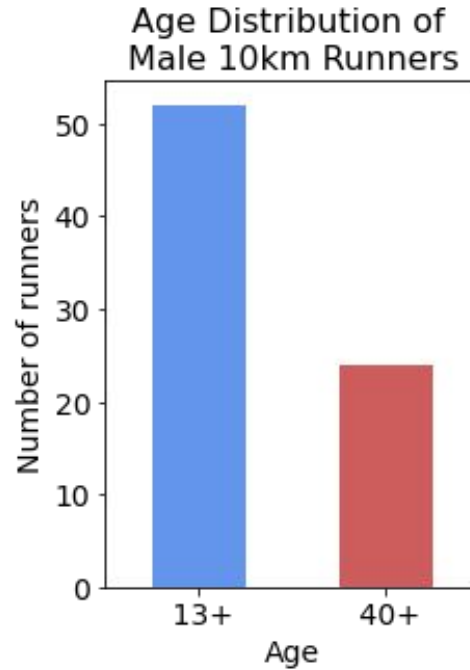
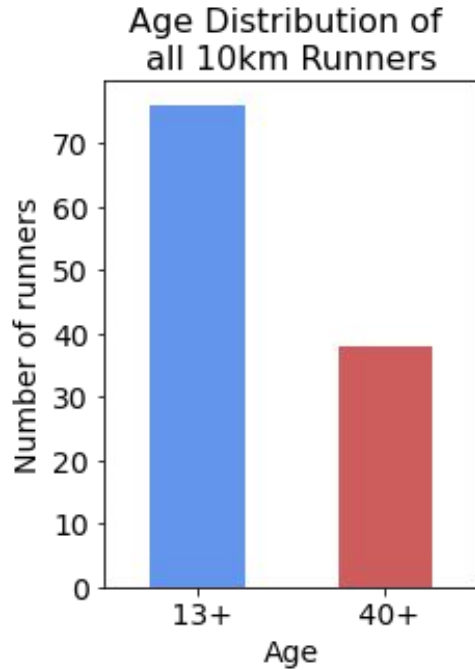


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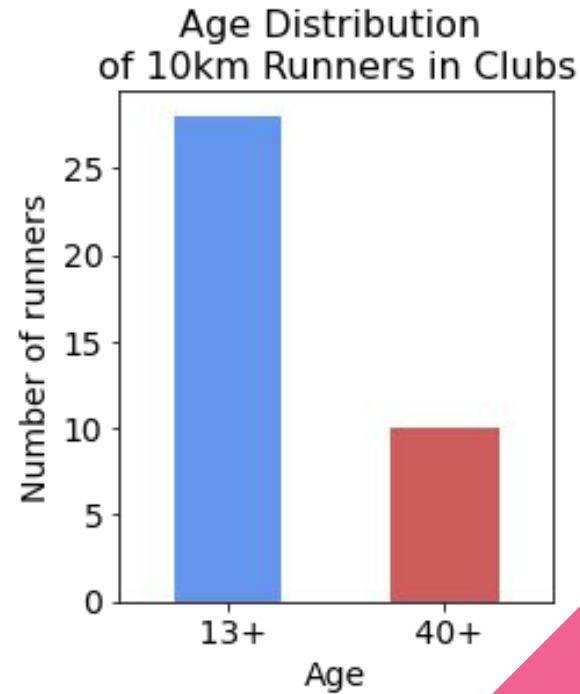
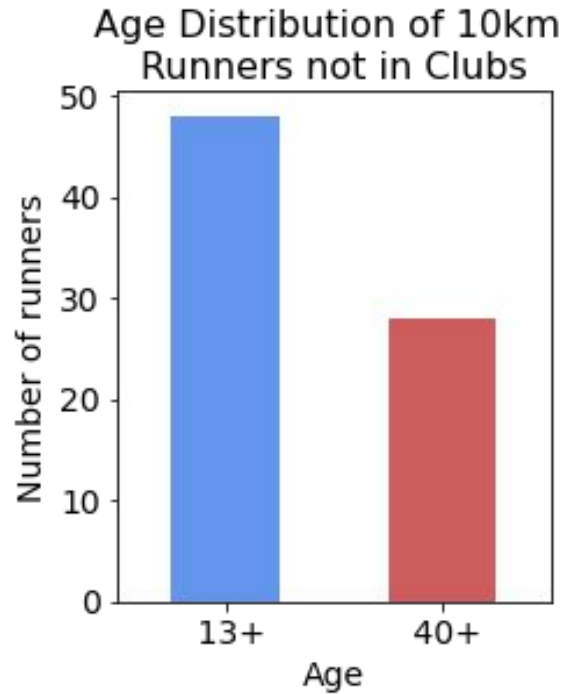
Q&A



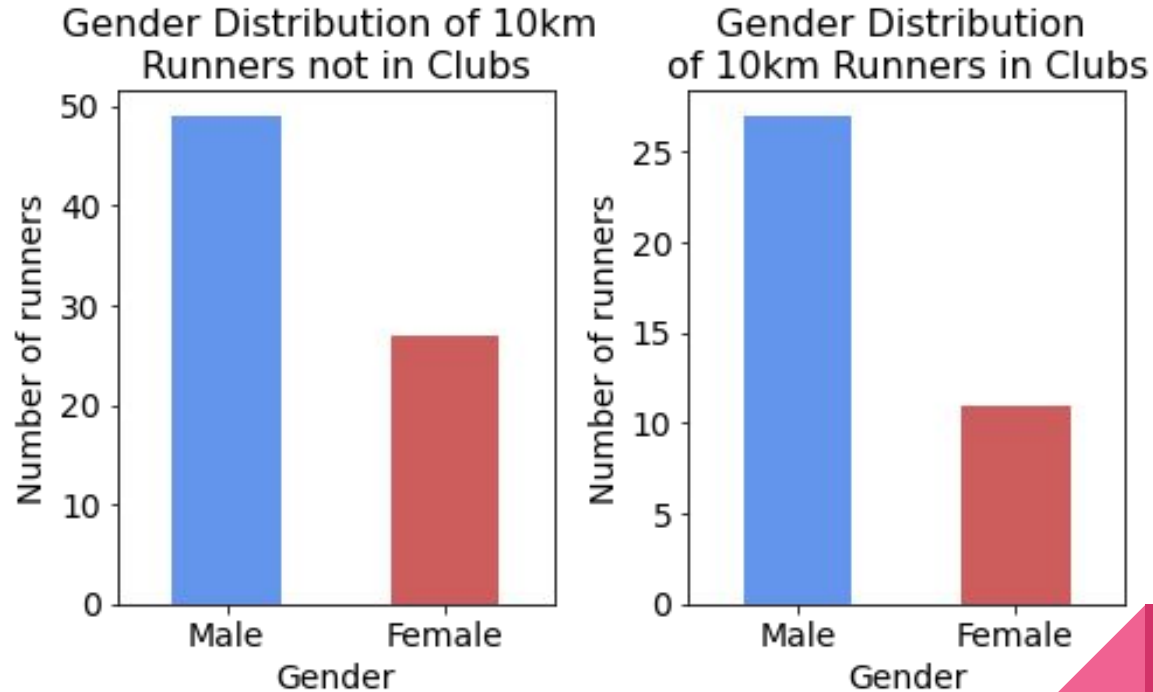
Age distributions



Age and Club Membership



Gender and Club Membership



Gender, Age, Club Membership

- Median for males 13+
NOT in clubs: 1h:01m
 - Median for males 13+ in clubs: 0h:49m
 - Median for males 40+
NOT in clubs: 1h:03m
 - Median for males 40+ in clubs: 0h:56m
 - Median for females 13+
NOT in clubs: 1h:20m
 - Median for females 13+ in clubs: 1h:09m
 - Median for females 40+
NOT in clubs: 1h:26m
 - Median for females 40+ in clubs: 1h:04m
- 