

Usage Funnels Project

Warby Parker

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WARBY PARKER

<u>Warby Parker</u> is a transformative lifestyle brand with a lofty objective: to offer designer eyewear at a revolutionary price while leading the way for socially conscious businesses. Founded in 2010 and named after two characters in an early Jack Kerouac journal, Warby Parker believes in creative thinking, smart design, and doing good in the world —for every pair of eyeglasses and sunglasses sold, a pair is distributed to someone in need.

In this project, you will analyze different Warby Parker's marketing funnels in order to calculate conversion rates. Here are the funnels and the tables that you are given:

Quiz Funnel:

Survey

Home Try-On Funnel

- quiz
- home_try_on
- purchase

Warby Parker Project Database Schema:

| Database Sci | hema | |
|-----------------|-----------|--|
| home_try_on | | |
| user_id | TEXT | |
| number_of_pairs | TEXT | |
| address | TEXT | |
| purchase | e 495 rov | |
| user_id | TEXT | |
| product_id | INTEGER | |
| style | TEXT | |
| model_name | TEXT | |
| color | TEXT | |
| price | INTEGER | |
| survey | 1986 rov | |
| question | TEXT | |
| user_id | TEXT | |
| response | TEXT | |
| quiz | 1000 rov | |
| user_id | TEXT | |
| style | TEXT | |
| fit | TEXT | |
| shape | TEXT | |
| color | TEXT | |

Project Tasks:

- 1. From survey, Select all columns from the first 10 rows.
- 2. What is the number of responses for each survey question?
- 3. Using a spreadsheet program like Excel or Google Sheets, calculate the percentage of users who answer each question. Which question(s) of the quiz have a lower completion rates? What do you think is the reason?
- 4. Warby Parker's purchase funnel is: Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses During the Home Try-On stage, we will be conducting an A/B Test: 50% of the users will get 3 pairs to try on 50% of the users will get 5 pairs to try on Let's find out whether or not users who get more pairs to try on at home will be more likely to make a purchase.
- 5. We'd like to create a new table with the following layout:

| user_id | is_home_try_on | number_of_pairs | is_purchase | |
|----------|----------------|-----------------|-------------|---|
| 4e8118dc | True | 3 | False | |
| 291f1cca | True | 5 | False | |
| 75122300 | False | NULL | False | ~ |
| 4 | | | | |

6. Once you have the data in the previous format, analyze it in several ways.

1. Project Task: survey

1.1 Description of the task

To help users find their perfect frame, Warby Parker has a Style Quiz that has the following questions:

- 1. "What are you looking for?"
- 2. "What's your fit?"
- 3. "Which shapes do you like?"
- 4. "Which colors do you like?"
- 5. "When was your last eye exam?

The users' responses are stored in a table called survey.

Select all columns from the first 10 rows. What columns does the table have?

1.2 Query of the survey table

• The survey table consists of three columns:

question user_id response

If not specified during the query the table rows are order by

user_id response question

• The database schema also lists the columns and the data type for each columns, and it has 1986 rows.

| survey | 1986 rows |
|----------|-----------|
| question | TEXT |
| user_id | TEXT |
| response | TEXT |

• We can see from the query output that the first customer listed on the table answered only the questions 1 and 2 and did not finish the survey quiz.

Query code

SELECT *
FROM survey
LIMIT 10;

| question | user_id | response |
|---------------------------------|--------------------------------------|------------------------------|
| 1. What are you looking for? | 005e7f99-d48c-4fce-b605-10506c85aaf7 | Women's Styles |
| 2. What's your fit? | 005e7f99-d48c-4fce-b605-10506c85aaf7 | Medium |
| 3. Which shapes do you like? | 00a556ed-f13e-4c67-8704-27e3573684cd | Round |
| 4. Which colors do you like? | 00a556ed-f13e-4c67-8704-27e3573684cd | Two-Tone |
| 1. What are you looking for? | 00a556ed-f13e-4c67-8704-27e3573684cd | I'm not sure. Let's skip it. |
| 2. What's your fit? | 00a556ed-f13e-4c67-8704-27e3573684cd | Narrow |
| 5. When was your last eye exam? | 00a556ed-f13e-4c67-8704-27e3573684cd | <1 Year |
| 3. Which shapes do you like? | 00bf9d63-0999-43a3-9e5b-9c372e6890d2 | Square |
| 5. When was your last eye exam? | 00bf9d63-0999-43a3-9e5b-9c372e6890d2 | <1 Year |
| 2. What's your fit? | 00bf9d63-0999-43a3-9e5b-9c372e6890d2 | Medium |
| | | |

2. Project Task:

Number of responses for each question

2.1 Description of the task

Users will "give up" at different points in the survey.

Let's analyze how many users move from Question 1 to Question 2, etc.

What is the number of responses for each question?

2.2 Query number of responses for each question

• We can answer the question, "What is the number of responses for each question?", by querying one table.

The database scheme shows that all the information we need to answer the question, is contained in the survey table.

- The query output is a funnel representing the journey of the costumers answering questions, from the first question, "What are you looking for?", to the last question, "When was your last eye exam?"
- The query of the survey table shows that about half of users starting the quiz are finishing the survey.

The conversion rate between the first and last question is 54%.

 $\frac{First\ question\ response\ *\ 100}{Last\ question\ responses}$

Ouerv code

SELECT question,

COUNT(DISTINCT user_id) AS 'responses'

FROM survey

GROUP BY 1;

| question | responses |
|---------------------------------|-----------|
| 1. What are you looking for? | 500 |
| 2. What's your fit? | 475 |
| 3. Which shapes do you like? | 380 |
| 4. Which colors do you like? | 361 |
| 5. When was your last eye exam? | 270 |

3. Project Task:

• Which question(s) of the quiz have a lower completion rates?

• What do you think is the reason?

3.1 Description of the task

Using a spreadsheet program like Excel or Google Sheets, calculate the percentage of users who answer each question:

Which question(s) of the quiz have a lower completion rates?

What do you think is the reason?

3.2 Questions completion rate funnel spreadsheet

| Question | Responses | Percent Completing this Question |
|--------------------------------|-----------|----------------------------------|
| 1. What are you looking for? | 500 | 100% |
| 2. What's your fit? | 475 | 95% |
| 3. Which shapes do you like? | 380 | 80% |
| 4. Which colors do you like? | 361 | 95% |
| 5. When was your last eye exam | 270 | 75% |

The above table was created with Excel and saved under the file name: questions_completion_rate.xlsx

3.2 Questions completion rate funnel spreadsheet analysis

Which question(s) of the quiz have lower completion rates?

Question 5 "When was your last eye exam?" has the lowest completion rate at 75%, followed by Question 3 "Which shapes do you like?" at 80%.

What do you think is the reason?

If I may elaborate, Question 5 has a low completion rate, probably because most people do not remember the date of their last eye exam and don't want to take the time to look it up. Additionally, it is likely that they do not feel comfortable giving an estimated answer to the question or selecting the "I'm not sure. Let's skip it" choice.

Another possibility is that some customers intend to answer the question but get sidetracked and never finish the survey.

About Question 3, there is a chance that some customers like more than one shape of glasses frame and are unsure which shape will fit them the best. It is possible that they do not realize that the survey quiz gives the option to choose more than one shape, or they do not feel comfortable selecting the "no preference choice".

4. Project Task: Warby Parker's purchase funnel

4.1 Description of the task

Warby Parker's purchase funnel is:

Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses

During the Home Try-On stage, we will be conducting an A/B Test:

50% of the users will get 3 pairs to try on

50% of the users will get 5 pairs to try on

Let's find out whether or not users who get more pairs to try on at home will be more likely to make a purchase.

The data will be distributed across three tables:

quiz home_try_on purchase

Examine the first five rows of each table

What are the column names?

4.2 What are the column names? Examine the first five rows of each table

• The database schema lists the columns, for each table, the column name, the column data type and numbers of rows in the table.

| Database | Schema | |
|-----------------|---------|-----------|
| home_t | ry_on | 750 rows |
| user_id | TEXT | |
| number_of_pairs | TEXT | |
| address | TEXT | |
| purch | ase | 495 rows |
| user_id | TEXT | |
| product_id | INTEGER | |
| style | TEXT | |
| model_name | TEXT | |
| color | TEXT | |
| price | INTEGER | |
| surv | rey | 1986 rows |
| question | TEXT | |
| user_id | TEXT | |
| response | TEXT | |
| qui | z | 1000 rows |
| user_id | TEXT | |
| style | TEXT | |
| fit | TEXT | |
| shape | TEXT | |
| color | TEXT | |

- The database schema shows that the user_id is the data, the key, that can be used to join the tables across the schema.
- The purchase table and the quiz table share some of the same data schema, (column names). The purchase table has an extra column, product_id, the table primary key, the user_id is a foreign key.

Query code

SELECT *
FROM quiz
LIMIT 5;

SELECT *
FROM home_try_on
LIMIT 5;

SELECT *
FROM purchase
LIMIT 5;

Query output

01fdf106-f73c-4d3f-a036-2f3e2ab1ce06

| user_id | style | fit | shape | color |
|--------------------------------------|-----------------|----------------------|---------------|---------------------|
| 4e8118dc-bb3d-49bf-85fc-cca8d83232ac | Women's Styles | Medium | Rectangular | Tortoise |
| 291f1cca-e507-48be-b063-002b14906468 | Women's Styles | Narrow | Round | Black |
| 75122300-0736-4087-b6d8-c0c5373a1a04 | Women's Styles | Wide | Rectangular | Two-Tone |
| 75bc6ebd-40cd-4e1d-a301-27ddd93b12e2 | Women's Styles | Narrow | Square | Two-Tone |
| ce965c4d-7a2b-4db6-9847-601747fa7812 | Women's Styles | Wide | Rectangular | Black |
| user_id | number_of_pairs | address | | |
| d8addd87-3217-4429-9a01-d56d68111da7 | 5 pairs | 145 New York 9a | | |
| f52b07c8-abe4-4f4a-9d39-ba9fc9a184cc | 5 pairs | 383 Madison Ave | | |
| 8ba0d2d5-1a31-403e-9fa5-79540f8477f9 | 5 pairs | 287 Pell St | | |
| 4e71850e-8bbf-4e6b-accc-49a7bb46c586 | 3 pairs | 347 Madison Square N | | |
| 3bc8f97f-2336-4dab-bd86-e391609dab97 | 5 pairs | 182 Cornelia St | | |
| user_id | product_id | style | model_name | color |
| 00a9dd17-36c8-430c-9d76-df49d4197dcf | 8 | Women's Styles | Lucy | Jet Black |
| 00e15fe0-c86f-4818-9c63-3422211baa97 | 7 | Women's Styles | Lucy | Elderflower Crystal |
| 017506f7-aba1-4b9d-8b7b-f4426e71b8ca | 4 | Men's Styles | Dawes | Jet Black |
| 0176bfb3-9c51-4b1c-b593-87edab3c54cb | 10 | Women's Styles | Eugene Narrow | Rosewood Tortoise |
| | | | | |

Women's Styles

Lucy

Jet Black

4.3 home_try_on table data exploration

• The following query of the home_try_on table output the number of users that got 5 pairs to try, the number of users that got 3 pairs to try on and the total number of user that got pairs.

The task description said that 50% of user got 5 pairs and the another 50% got 3 pairs.

The data from the home_try_on table furnish for this exercise has a discrepancy between the number of users that got 5 pairs and the number of users that got 3 pairs.

Number of user that got 5 pairs try on is 371. Number of user that got 3 pairs try on is 379. With a total of 750.

Ougry output

| Query Output | | |
|--------------------------|--------------------------|------------------------------|
| number_of_5_pairs_try_on | number_of_3_pairs_try_on | total_number_of_pairs_try_on |
| 371 | 379 | 750 |

4.4 Percentage of users with 5 and 3 pairs try on

• The following query of the home_try_on table output the number of users that received 5 pairs to try, the number of users that received 3 pairs to try as percentages. (49.47% of users received 5 pairs and 50.53% got 3 pairs.)

```
Query code
```

```
WITH pairs_users_totals AS (
    SELECT
     -- Number of customers that received 5 pairs try-on
     COUNT(DISTINCT CASE
             WHEN number_of_pairs = '5 pairs' THEN user_id
           END) AS 'number_of_5_pairs_try_on',
     -- Number of customers that received 3 pairs try-on
     COUNT(DISTINCT CASE
             WHEN number_of_pairs = '3 pairs' THEN user_id
           END) AS 'number_of_3_pairs_try_on',
     -- Total number of customers that received pairs try-on
     COUNT (*) AS 'total_number_of_pairs_try_on'
   FROM home_try_on)
-- Decimal percentages computations
SELECT ROUND(1.0 * number_of_5_pairs_try_on * 100 / total_number_of_pairs_try_on, 2) AS
'%_of_users_that_got_5_pairs',
      ROUND(1.0 * number_of_3_pairs_try_on * 100 / total_number_of_pairs_try_on, 2) AS
'%_users_that_got_3_pairs'
FROM pairs_users_totals;
```

```
%_of_users_that_got_3_pairs %_users_that_got_3_pairs 50.53
```

5. Project Task: Create a new table

5.1 Description of the task

We'd like to create a new table with the following layout:

| user_id | is_home_try_on | number_of_pairs | is_purchase | - |
|----------|----------------|-----------------|-------------|----|
| 4e8118dc | True | 3 | False | |
| 291f1cca | True | 5 | False | |
| 75122300 | False | NULL | False | ~ |
| 4 | | | | þ. |

Each row will represent a single user from the browse table:

- If the user has any entries in home_try_on, then is_home_try_on will be 'True'.
- number_of_pairs comes from home_try_on table
- If the user has any entries in is_purchase, then is_purchase will be 'True'.

Use a LEFT JOIN to combine the three tables, starting with the top of the funnel (quiz) and ending with the bottom of the funnel (purchase).

Select only the first 10 rows from this table.

5.2 The Table

b1dded76-cd60-4222-82cb-f6d464104298

- The query outputs the user ids of customers who registered for a home frame try on, but it also outputs the user ids of users that did not, resulting, for those user ids, of a NULL output in the number_of_pairs column and a False output in the columns is_home_try_on and is_purchase.
- I debate the usefulness of displaying entire rows, where, with the exception the customer user id (primary key), the second column with a NULL output will have the consequence of a NULL output for all remaining columns.

Outputting a table using an INNER JOIN clause to join the tables quiz and home_try_on will eliminate entire rows with only NULL outputs, and it seems to be a more useful data output to display, the LEFT JOIN clause should still be used to join the reminding tables.

Query output

| user_id | is_home_try_on | number_of_pairs | is_purchase |
|--------------------------------------|----------------|-----------------|-------------|
| 4e8118dc-bb3d-49bf-85fc-cca8d83232ac | True | 3 | False |
| 291f1cca-e507-48be-b063-002b14906468 | True | 3 | True |
| 75122300-0736-4087-b6d8-c0c5373a1a04 | False | NULL | False |
| 75bc6ebd-40cd-4e1d-a301-27ddd93b12e2 | True | 5 | False |
| ce965c4d-7a2b-4db6-9847-601747fa7812 | True | 3 | True |
| 28867d12-27a6-4e6a-a5fb-8bb5440117ae | True | 5 | True |
| 5a7a7e13-fbcf-46e4-9093-79799649d6c5 | False | NULL | False |
| 0143cb8b-bb81-4916-9750-ce956c9f9bd9 | False | NULL | False |
| a4ccc1b3-cbb6-449c-b7a5-03af42c97433 | True | 5 | False |
| | | | |

False

True

```
SELECT DISTINCT q.user_id,
    -- try-on true or false
    CASE
      WHEN h.user_id IS NOT NULL THEN 'True'
      ELSE 'False'
    END AS 'is_home_try_on',
    -- 5 pairs, 3 pairs or NULL
    CASE
      WHEN h.number_of_pairs = '5 pairs' THEN '5'
      WHEN h.number_of_pairs = '3 pairs' THEN '3'
      ELSE 'NULL'
    END AS 'number_of_pairs',
    -- purchase true or false
    CASE
      WHEN p.user_id IS NOT NULL THEN 'True'
      ELSE 'False'
    END AS 'is_purchase'
FROM quiz q
LEFT JOIN home_try_on h
 ON q.user_id = h.user_id
LEFT JOIN purchase p
 ON p.user_id = q.user_id
LIMIT 10;
```

6. Project Task: Analyze data

6.1 Description of the task

Once we have the data in this format, we can analyze it in several ways:

We can calculate overall conversion rates by aggregating across all rows.

We can compare conversion from quiz→home_try_on and home_try_on→purchase.

We can calculate the difference in purchase rates between customers who had 3 number_of_pairs with ones who had 5.

And more!

We can also use the original tables to calculate things like:

The most common results of the style quiz.

The most common types of purchase made.

And more!

What are some actionable insights for Warby Parker?

6.2 Numbers query of the Warby Parker's purchase funnel

· Warby Parker's purchase funnel is:

Query output

Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses

- The query outputs the numbers for each step of the funnel, splitting the Home Try-on step into 3 categories, total number of Home Try-on, total number of Home Try-On with 5 pairs and total number of Home Try-On with 3 pairs.
- The query outputs the total number of purchases into 3 categories, the total number of purchases, the number of Home Try-On 5 pairs purchases and the number of Home Try-On 3 pairs purchases.
- A quick look at the query results, shows that the number of purchases from customers who received 5 pairs to try-on is significantly higher than the customers that received 3 pairs to try-on.

294 purchase from customers who received 5 pairs try-on 201 purchase from customers who received 3 pairs try-on

| number_of_quiz | total_number_of_pairs_try_on | number_of_purchases | number_of_5_pairs_try_on | number_of_3_pairs_try_on | number_of_purchases_with_5_pairs_try_on | number_of_purchases_with_3_pairs_try_on |
|----------------|------------------------------|---------------------|--------------------------|--------------------------|---|---|
| 1000 | 750 | 495 | 371 | 379 | 294 | 201 |

```
Query code
```

```
WITH funnel AS (
  SELECT DISTINCT q.user_id,
      h.user_id IS NOT NULL AS 'is_home_try_on',
      h.number_of_pairs,
      p.user_id IS NOT NULL AS 'is_purchase'
FROM quiz q
LEFT JOIN home_try_on h
  ON q.user_id = h.user_id
LEFT JOIN purchase p
  ON p.user_id = q.user_id)
SELECT COUNT(*) AS 'number_of_quiz',
   SUM(is_home_try_on) AS 'total_number_of_pairs_try_on',
    -- Total purchases
   SUM(is_purchase) AS 'number_of_purchases',
    -- Number of 5 pairs try-on
   COUNT(DISTINCT CASE
           WHEN number_of_pairs = '5 pairs' THEN user_id
          END) AS 'number_of_5_pairs_try_on',
     -- Number of 3 pairs try-on
   COUNT(DISTINCT CASE
           WHEN number_of_pairs = '3 pairs' THEN user_id
          END) AS 'number_of_3_pairs_try_on',
    -- Nummber of purchase with 5 pairs try-on
   COUNT(DISTINCT CASE
           WHEN number_of_pairs = '5 pairs' AND is_purchase = 1 THEN user_id
          END) AS 'number_of_purchases_with_5_pairs_try_on',
    -- Nummber of purchase with 3 pairs try-on
   COUNT(DISTINCT CASE
           WHEN number_of_pairs = '3 pairs' AND is_purchase = 1 THEN user_id
          END) AS 'number_of_purchases_with_3_pairs_try_on'
FROM funnel;
```

6.3 Funnel overall conversion rate

- Warby Parker's purchase funnel is:
 Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses
- Style Quiz → Home Try-On
 From 1000 guizzes 75% of the customers registered for the Home Try-on glasses frame step.
- Home Try-On → Purchase the Perfect Pair of Glasses
 66% of the registered Home Try-on customers purchased glasses frames.

The data from A/B test giving 50% of the users will get 5 pairs to try on and the another 50% will get 3 pairs to try on, shows that there is a significant difference of purchase outcomes between the customers who got 5 pairs and those who got 3 pairs.

Note: The task description said that 50% of users got 5 pairs and the another 50% got 3 pairs, but the data from the home try on table furnished for

this exercise has a discrepancy between the number of users that got 5 pairs and the number of users that got 3 pairs.

Number of user that got 5 pairs to try on is 371, number of user that got 3 pairs to try on is 379, with a total of 750. The code query takes account for the discrepancy between the number of users that got 5 pairs and the number of users that got 3 pairs.

• The 5 pairs Home Try-on test has a purchase conversion rate of 79.25%, compared to 3 pairs Home Try-on test with a purchase conversion rate of 53.03%. There is a difference of 26.02% between the two. By giving 5 pairs Home Try-on to all their costumers instead of 3 pairs, Warby Parker may increase the overall conversion rate from the Home Try-on step to Purchase the Perfect Pair of Glasses by 26.02%.

Query output

number_of_quiz %_quiz_to_home_try_on %_home_try_on_to_purchase %_5_pairs_try_on_to_purchase %_3_pairs_try_on_to_purchase 1000 75.0 66.0 79.25 53.03

```
WITH funnel AS (
   SELECT DISTINCT q.user_id,
      h.user_id IS NOT NULL AS 'is_home_try_on',
      h.number_of_pairs,
      p.user_id IS NOT NULL AS 'is_purchase'
FROM quiz q
LEFT JOIN home_try_on h
   ON q.user_id = h.user_id
LEFT JOIN purchase p
   ON p.user_id = q.user_id)
SELECT COUNT(*) AS 'number_of_quiz',
    -- Conversion rate in percentages of quiz to home try-on and home try-on to purchase
    -- Multiplying by 1.0 will output a decimal number
   ROUND(1.0 * SUM(is_home_try_on) * 100 / COUNT(*), 2) AS '%_quiz_to_home_try_on',
   ROUND(1.0 * SUM(is_purchase) * 100 / SUM(is_home_try_on), 2) AS '%_home_try_on_to_purchase',
    -- Conversion rate in percentages of 5 pairs try-on to purchase
   ROUND(1.0 * COUNT(DISTINCT CASE -- Number of purchase by customers that got 5 pairs
                          WHEN number_of_pairs = '5 pairs' AND is_purchase = 1 THEN user_id
                      END) * 100 / COUNT(DISTINCT CASE -- Number of customers that got 5 pairs
                                           WHEN number_of_pairs = '5 pairs' THEN user_id
                                         END), 2) AS '%_5_pairs_try_on_to_purchase',
      -- Conversion rate in percentages of 3 pairs try-on to purchase
    ROUND(1.0 * COUNT(DISTINCT CASE -- Number of purchase by customers that got 3 pairs
                          WHEN number_of_pairs = '3 pairs' AND is_purchase = 1 THEN user_id
                        END) * 100 / COUNT(DISTINCT CASE -- Number of customers that got 3 pairs
                                           WHEN number_of_pairs = '3 pairs' THEN user_id
                                          END), 2) AS '%_3_pairs_try_on_to_purchase'
FROM funnel;
```

6.4 Conversion rates, Quiz → Purchase

- Funnel conversion rates from Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses
- Style Quiz → Purchase the Perfect Pair of Glasses
 From 1000 quizzes 49.5% of the customers purchased a glasses frame.

The data from A/B test giving 50% of the users will get 5 pairs to try on and the another 50% will get 3 pairs to try on, shows that there is a significant difference of purchase outcomes between the customers who got 5 pairs and those who got 3 pairs.

Note: The task description said that 50% of users got 5 pairs and the another 50% got 3 pairs, but the data from the home_try_on table furnished for this exercise has a discrepancy between the number of users that got 5 pairs and the number of users that got 3 pairs.

Number of user that got 5 pairs to try on is 371, number of user that got 3 pairs to try on is 379, with a total of 750. The code query takes account for the discrepancy between the number of users that got 5 pairs and the number of users that got 3 pairs.

- Quiz → 5 pair Purchase the Perfect Pair of Glasses
 The purchase conversion rate from the 1000 quizzes to Purchase under the test A/B giving 5 pairs to try-on is 59.43%.
 Quiz → 3 pair Purchase the Perfect Pair of Glasses
 - The purchase conversion rate from the 1000 quizzes to Purchase under the test A/B giving 3 pairs to try-on is 39.79%

There is a difference of 19.65% between the two tests. By giving 5 pairs Home Try-on to all his costumers instead of 3 pairs, Warby Parker may increase the overall conversion rate from the Quiz step to Purchase by 19.65%.

| number_of_quiz | %_quiz_to_purchase | %_quiz_to_purchase_5_pairs_try_on | <pre>%_quiz_to_purchase_3_pairs_try_or</pre> |
|----------------|--------------------|-----------------------------------|--|
| 1000 | 49.5 | 59.43 | 39.78 |

```
WITH funnel AS (
  SELECT DISTINCT q.user_id,
       h.user_id IS NOT NULL AS 'is_home_try_on',
      h.number_of_pairs,
       p.user_id IS NOT NULL AS 'is_purchase'
FROM auiz a
LEFT JOIN home_try_on h
  ON q.user_id = h.user_id
LEFT JOIN purchase p
  ON p.user_id = q.user_id)
SELECT COUNT(*) AS 'number_of_quiz',
     -- Conversion rate in percentages of quiz to purchase
    -- Multiplying by 1.0 will output a decimal number
   ROUND(1.0 * SUM(is_purchase) * 100 / COUNT(*), 2) AS '%_quiz_to_purchase',
    -- Conversion rate in percentages of guiz to purchase for customers that got 5 pairs try-on
   ROUND(1.0 * COUNT(DISTINCT CASE -- Number of purchase by customers that got 5 pairs
                          WHEN number_of_pairs = '5 pairs' AND is_purchase = 1 THEN user_id
                     END) * 100 / (COUNT(*) / (100 / ROUND(1.0 * COUNT(DISTINCT CASE -- Number of customers that got 5 pairs
                                                                             WHEN number_of_pairs = '5 pairs' THEN user_id
                                                                          END) * 100 / SUM(is_home_try_on), 2))), 2) AS '%_quiz_to_purchase_5_pairs_try_on',
    -- Conversion rate in percentages of quiz to purchase for customers that got 3 pairs try-on
   ROUND(1.0 * COUNT(DISTINCT CASE -- Number of purchase by customers that got 5 pairs
                          WHEN number_of_pairs = '3 pairs' AND is_purchase = 1 THEN user_id
                     END) * 100 / (COUNT(*) / (100 / ROUND(1.0 * COUNT(DISTINCT CASE -- Number of customers that got 3 pairs
                                                                             WHEN number_of_pairs = '3 pairs' THEN user_id
                                                                          END) * 100 / SUM(is_home_try_on), 2))), 2) AS '%_quiz_to_purchase_3_pairs_try_on'
FROM funnel;
```

6.5 The most common results of the style quiz

• The most common results of the style quiz are:

For men: Narrow Rectangular Tortoise glasses frame with 23 results

For women: Narrow Rectangular Black glasses frame with 20 results

Narrow Rectangular Tortoise glasses frame with 20 results

```
Query code

SELECT COUNT(DISTINCT user_id) AS 'number_of_common_types',
    style,
    fit,
    shape,
    color
FROM quiz
GROUP BY 2, 3, 4, 5
ORDER by 1 DESC
LIMIT 3;
```

| number_of_common_types | style | fit | shape | color |
|------------------------|----------------|--------|-------------|----------|
| 23 | Men's Styles | Narrow | Rectangular | Tortoise |
| 20 | Women's Styles | Narrow | Rectangular | Black |
| 20 | Women's Styles | Narrow | Rectangular | Tortoise |

6.6 Conversion rates for common styles

Results conversion rate from the quiz table:

- From 1000 quizzes, 46.9% of the customers choose the Women's Styles and 43.2% choose the Men's Styles.
- From the total of costumers that choose the Men's Styles

5.32% also choose the style Narrow Rectangular Tortoise.

• From the total of costumers that choose the Women's Styles

4.26% also choose the style Narrow Rectangular Black,

4.26% also choose the style Narrow Rectangular Tortoise.

| total_number_of_quiz | %_style_women | %_style_men | %_men_narrow_rec_tortoise | %_women_narrow_rec_black | %_women_narrow_rec_tortoise |
|----------------------|---------------|-------------|---------------------------|--------------------------|-----------------------------|
| 1000 | 46.9 | 43.2 | 5.32 | 4.26 | 4.26 |

```
WITH number_of_common_results AS (
   SELECT COUNT(DISTINCT user_id) AS 'total_number_of_quiz',
        COUNT(DISTINCT CASE -- Number of Women's styles
                    WHEN style = 'Women''s Styles' THEN user_id
             END) AS 'num_style_women',
        COUNT(DISTINCT CASE -- Number of Men's styles
                    WHEN style = 'Men''s Styles' THEN user_id
             END) AS 'num_style_men',
       COUNT(DISTINCT CASE -- Number of Men's styles Narrow Rectangular Tortoise
                    WHEN style = 'Men''s Styles'
                     AND fit = 'Narrow'
                     AND shape = 'Rectangular'
                     AND color = 'Tortoise'
                    THEN user_id
             END) AS 'num_style_men_narrow_rec_tortoise'.
        COUNT(DISTINCT CASE -- Number of Women's styles Narrow Rectangular Black
                    WHEN style = 'Women''s Styles'
                     AND fit = 'Narrow'
                     AND shape = 'Rectangular'
                     AND color = 'Black'
                    THEN user_id
             END) AS 'num_style_women_narrow_rec_black',
     COUNT(DISTINCT CASE -- Number of Women's styles Narrow Rectangular Tortoise
                    WHEN style = 'Women''s Styles'
                     AND fit = 'Narrow'
                      AND shape = 'Rectangular'
                      AND color = 'Tortoise'
                     THEN user_id
           END) AS 'num_style_women_narrow_rec_tortoise'
   FROM quiz)
SELECT total_number_of_quiz,
   -- Conversion rates in percentages
   -- Multiplying by 1.0 will output a decimal number
   ROUND(1.0 * num_style_women * 100 / total_number_of_quiz, 2) AS '%_style_women',
   ROUND(1.0 * num_style_men * 100 / total_number_of_quiz, 2) AS '%_style_men',
   ROUND(1.0 * num_style_men_narrow_rec_tortoise * 100 / num_style_men, 2) AS '%_men_choose_style_narrow_rec_tortoise',
   ROUND(1.0 * num_style_women_narrow_rec_black * 100 / num_style_women, 2) AS '%_women_choose_style_narrow_rec_black',
   ROUND(1.0 * num_style_women_narrow_rec_tortoise * 100 / num_style_women, 2) A5 '%_women_choose_style_narrow_rec_tortoise'
FROM number_of_common_results;
```

6.7 The most common types of purchase made

The most common type of purchases made are:

- For men:
 Dawes driftwood fade glasses frames with 63 purchases
- For women:
 Eugene Narrow rosewood tortoise glasses frames with 62 purchases

```
SELECT COUNT(DISTINCT user_id) AS 'number_of_purchases',
    product_id,
    style,
    model_name,
    color,
    price
FROM purchase
GROUP BY 3, 4, 5, 6
ORDER by 1 DESC
LIMIT 2;
```

| number_of_purchases | product_id | style | model_name | color | price |
|---------------------|------------|----------------|---------------|-------------------|-------|
| 63 | 3 | Men's Styles | Dawes | Driftwood Fade | 150 |
| 62 | 10 | Women's Styles | Eugene Narrow | Rosewood Tortoise | 95 |

6.8 Conversion rates for common purchases

Results conversion rate from the purchase table:

- From 495 purchases 50.91% of the customers purchased a Women's Styles glasses frame and 49.09% purchased a Men's Style.
- From the total of costumers that purchased a Men's Styles,
 25.93% choose to purchases the Dawes Driftwood Fade glasses frame, with a product id of 3.
- From the total of costumers that purchased a Women's Styles,
 24.6% choose to purchases the Eugene Narrow Rosewood Tortoise glasses frame, with a product id of 10.

| total_number_of_purchase | %_style_women_purchases | %_style_men_purchases | %_men_product_id_3_purchases | %_women_product_id_10_purchases | |
|--------------------------|-------------------------|-----------------------|------------------------------|---------------------------------|--|
| 495 | 50.91 | 49.09 | 25.93 | 24.6 | |

```
WITH number_of_common_purchases AS (
    SELECT COUNT(DISTINCT user_id) AS 'total_number_of_purchase',
        COUNT(DISTINCT CASE -- Number of Women's styles purchases
                    WHEN style = 'Women''s Styles' THEN user_id
             END) AS 'num_style_women_purchases',
        COUNT(DISTINCT CASE -- Number of Men's styles purchases
                    WHEN style = 'Men''s Styles' THEN user_id
              END) AS 'num_style_men_purchases',
        COUNT DISTINCT CASE -- Number of Men's styles Dawes Driftwood Fade purchases
                    WHEN product_id = 3
                      AND style = 'Men''s Styles'
                      AND model_name = 'Dawes'
                      AND color = 'Driftwood Fade'
                      AND price = 150
                    THEN user_id
              END) AS 'num_men_product_id_3_purchases',
        COUNT(DISTINCT CASE -- Number of Women's styles Eugene Narrow Rosewood Tortoise purchases
                    WHEN product_id = 10
                      AND style = 'Women''s Styles'
                      AND model_name = 'Eugene Narrow'
                      AND color = 'Rosewood Tortoise'
                      AND price = 95
                    THEN user_id
             END) AS 'num_women_product_id_10_purchases'
    FROM purchase)
SELECT total_number_of_purchase,
    -- Conversion rates in percentages
    -- Multiplying by 1.0 will output a decimal number
   ROUND(1.0 * num_style_women_purchases * 100 / total_number_of_purchase, 2) AS '%_style_women_purchases',
   ROUND(1.0 * num_style_men_purchases * 100 / total_number_of_purchase, 2) AS '%_style_men_purchases',
   ROUND(1.0 * num_men_product_id_3_purchases * 100 / num_style_men_purchases, 2) AS '%_men_product_id_3_purchases',
   ROUND(1.0 * num_women_product_id_10_purchases * 100 / num_style_women_purchases, 2) AS '%_women_product_id_10_purchases'
FROM number_of_common_purchases;
```

6.9.1 What are some actionable insights for Warby Parker?

• The query of the survey table shows 54% of users starting the quiz are finishing the survey.

Question 5 "When was your last eye exam?" has the lowest completion rate at 75% Question 3 "Which shapes do you like?" follows question 5 with a completion rate at 80%

Improving the completion of the questions 5 and 3 will also improve the number of the customers finishing the survey.

6.9.2 What are some actionable insights for Warby Parker?

Warby Parker's purchase funnel is Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses

- Style Quiz → Home Try-On
 From 1000 guizzes 75% of the customers registered for the Home Try-on glasses frame step.
- Home Try-On → Purchase the Perfect Pair of Glasses

66% of the registered Home Try-on customers purchased glasses frame. The 5 pairs Home Try-on test has a purchase conversion rate of 79.25%, compared to 3 pairs Home Try-on test with a purchase conversion rate of 53.03%.

There is a difference of 26.02% between the two, by giving 5 pairs Home Try-on to all their costumers instead of 3 pairs, Warby Parker may increase the overall conversion rate from the Home Try-on step to Purchase by 26.02%.

6.9.3 What are some actionable insights for Warby Parker?

Warby Parker's purchase funnel is Take the Style Quiz → Home Try-On → Purchase the Perfect Pair of Glasses

• Style Quiz → Purchase the Perfect Pair of Glasses

From 1000 guizzes 49.5% of the customers purchase a glasses frame.

The purchase conversion rate from the 1000 quizzes to Purchase under the test A/B giving 5 pairs to try-on is 59.43%. The purchase conversion rate from the 1000 quizzes to Purchase under the test A/B giving 3 pairs to try-on is 39.79%.

There is a difference of 19.65% between the two test, by giving 5 pairs Home Try-on to all their costumers instead of 3 pairs, Warby Parker may increase the overall conversion rate from the Quiz step to Purchase by 19.65%.

6.9.4 What are some actionable insights for Warby Parker?

Results conversion rate from the quiz table:

- From 1000 guizzes 46.9% of the customers choose the Women's Styles and 43.2% choose the Men's Styles.
- · From the total of costumers that choose the Men's Styles

5.32% also choose the style Narrow Rectangular Tortoise.

- From the total of costumers that choose the Women's Styles
 - 4.26% also choose the style Narrow Rectangular Black,
 - 4.26% also choose the style Narrow Rectangular Tortoise.

The Narrow Rectangular Tortoise are the most popular choice of frames for women and men, offering more variants of the color Tortoise, will improve the website glasses frames suggestions to the customers during the Home Try-on frame selecting step.

6.9.5 What are some actionable insights for Warby Parker?

Results conversion rate from the purchase table:

- The most popular frame for women is Eugene Narrow Rosewood Tortoise glasses frame, with a product id of 10, and for men is Dawes Driftwood Fade glasses frame, with a product id of 3.
- From 495 purchases 50.91% of the customers purchased a Women's Styles glasses frame and 49.09% a Men's Styles.
- From the total of costumers that purchased a Men's Styles,
 25.93% choose to purchases the Dawes Driftwood Fade glasses frame, with a product id of 3.
- From the total of costumers that purchased a Women's Styles,
 24.6% choose to purchases the Eugene Narrow Rosewood Tortoise glasses frame, with a product id of 10.

Offering more variants Dawes Driftwood Fade glasses frame and Eugene Narrow Rosewood Tortoise glasses, will possibly improve the conversion rate from Home Try-on to Purchase the Perfect Pair of Glasses.