



# Warby Parker's Marketing Funnels

Learn SQL from Scratch

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# **1. Get familiar with Warby Parker Data**

# 1.1 Contents of survey database

The survey data contains the responses for users to questions in the customer survey. Ten rows are included below

```
SELECT
FROM
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. What is the Quiz Funnel

## 2.1 Quiz funnel from survey

```
SELECT question, COUNT(DISTINCT
user_id) AS
'question_completion'
FROM survey
GROUP BY 1
ORDER BY 1;
```

This query shows the count of users who complete each question in the survey. These results demonstrate that a number of users will abandon the survey with each progressive question.

| question                        | question_completion |
|---------------------------------|---------------------|
| 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                 |

## 2.2 Percentage of question completion

It's no surprise that 100% of users complete question 1 because this is the criteria for inclusion in the data set.

Q.2 and Q4 are both showing a 95% completion rate. This might be attributed to the ease for answer; fit and color are simple no intrusive questions.

Q.3 has an 20% drop rate, and this might be attributed to the need for trying glasses on to see if the shape suits the user.

Q.4 has a 25% drop rate. This question is the final question in the survey and is more intrusive than the previous four. Users may not remember when their last exam was, or they maybe embarrassed if they have not had an eye exam in many years.

| Question                        | Completers | Raters | Percentage |
|---------------------------------|------------|--------|------------|
| 1. What are you looking for?    | 500        | 500    | 100        |
| 2. What's your fit?             | 475        | 500    | 95         |
| 3. Which shapes do you like?    | 380        | 475    | 80         |
| 4. Which colors do you like?    | 361        | 380    | 95         |
| 5. When was your last eye exam? | 270        | 361    | 74.79      |

### **3. A/B Testing with Home Try-On Funnel**



# 3.1 Contents of Try-On Funnel databases

The table below lists the columns for the three data sets used with the Try-On Funnel.

- quiz contains 1000 rows
- home\_try\_on contains 750 rows
- purchase contains 495 rows

```
SELECT *  
FROM quiz  
LIMIT 5;  
  
SELECT *  
FROM home_try_on  
LIMIT 5;  
  
SELECT *  
FROM purchase  
LIMIT 5;
```

| quiz    |      | home_try_on     |      | purchase   |         |
|---------|------|-----------------|------|------------|---------|
| user_id | TEXT | user_id         | TEXT | user_id    | TEXT    |
| style   | TEXT | number_of_pairs | TEXT | product_id | INTEGER |
| fit     | TEXT | address         | TEXT | style      | TEXT    |
| shape   | TEXT |                 |      | model_name | TEXT    |
| color   | TEXT |                 |      | color      | TEXT    |
|         |      |                 |      | price      | INTEGER |

# 3.2 Try on to purchase for individual users

The table below shows the query results for ten users detailing the funnel from home\_try\_on to is\_purchased. This query includes the number of frames sent that the individual was able to sample.

```
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_purchased'
FROM quiz AS 'q'
LEFT JOIN home_try_on AS 'h'
      ON q.user_id = h.user_id
LEFT JOIN purchase AS 'p'
      ON q.user_id = p.user_id
LIMIT 10;
```

| user_id                              | is_home_try_on | number_of_pairs | Is_purchased |
|--------------------------------------|----------------|-----------------|--------------|
| 4e8118dc-bb3d-49bf-85fc-cca8d83232ac | 1              | 3 pairs         | 0            |
| 291f1cca-e507-48be-b063-002b14906468 | 1              | 3 pairs         | 1            |
| 75122300-0736-4087-b6d8-c0c5373a1a04 | 0              |                 | 0            |
| 75bc6ebd-40cd-4e1d-a301-27ddd93b12e2 | 1              | 5 pairs         | 0            |
| ce965c4d-7a2b-4db6-9847-601747fa7812 | 1              | 3 pairs         | 1            |
| 28867d12-27a6-4e6a-a5fb-8bb5440117ae | 1              | 5 pairs         | 1            |
| 5a7a7e13-fbcf-46e4-9093-79799649d6c5 | 0              |                 | 0            |
| 0143cb8b-bb81-4916-9750-ce956c9f9bd9 | 0              |                 | 0            |
| a4ccc1b3-cbb6-449c-b7a5-03af42c97433 | 1              | 5 pairs         | 0            |
| b1dded76-cd60-4222-82cb-f6d464104298 | 1              | 3 pairs         | 0            |

## 4. Further Analysis

## 4.1 Try-on funnel analysis

```
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_purchased'
FROM quiz AS 'q'
LEFT JOIN home_try_on AS 'h'
      ON q.user_id = h.user_id
LEFT JOIN purchase AS 'p'
      ON q.user_id = p.user_id
)
SELECT SUM(is_home_try_on) AS 'sampled',
SUM(is_purchased) AS 'purchased'
FROM funnel;
```

| sampled | purchased | conversion rate |
|---------|-----------|-----------------|
| 750     | 495       | 66%             |

```
WITH funnel AS (SELECT DISTINCT q.user_id,
h.user_id IS NOT NULL AS 'is_home_try_on',
h.number_of_pairs AS 'number_of_pairs', ...
```

```
... SELECT MAX(number_of_pairs) AS
'maximum', MIN (number_of_pairs) AS
'minimum'
FROM funnel;
```

```
SELECT number_of_pairs AS '#_pairs_tried',
Count (number_of_pairs) AS '#_orders'
FROM home_try_on
GROUP BY 1;
```

| maximum       | minimum  |
|---------------|----------|
| 5 pairs       | 3 pairs  |
| #_pairs_tried | #_orders |
| 3 pairs       | 379      |
| 5 pairs       | 371      |

The query on the left shows the conversion data for users who sampled frames that lead to purchases.

The query on the right shows that the difference in conversion between those who sampled 5 pair and 3 pairs negligible. I started by checking if 3 pairs and 5 pairs were the range of samples in the first part of the query, then compared the orders in the second part of the query

## 4.2 Quiz analysis

```
SELECT style, COUNT(style) AS 'tstyle'
FROM quiz
GROUP BY style
ORDER BY tstyle DESC
LIMIT 5;
```

```
SELECT fit, COUNT(fit) AS 'tfits'
FROM quiz
GROUP BY fit
ORDER BY 2 DESC
LIMIT 5;
```

```
SELECT shape, COUNT(shape) AS 'shape'
FROM quiz
GROUP BY shape
ORDER BY 2 DESC
LIMIT 5;
```

```
SELECT color, COUNT(color) AS 'tcolor'
FROM quiz
GROUP BY color
ORDER BY 2 DESC
LIMIT 5;
```

| style                        | tstyle | shape         | tshape |
|------------------------------|--------|---------------|--------|
| Women's Styles               | 469    | Rectangular   | 397    |
| Men's Styles                 | 432    | Square        | 326    |
| I'm not sure. Let's skip it. | 99     | Round         | 180    |
| fit                          | tfits  | No Preference | 97     |
| Narrow                       | 408    | color         | tcolor |
| Medium                       | 305    | Tortoise      | 292    |
| Wide                         | 198    | Black         | 280    |
| I'm not sure. Let's skip it. | 89     | Crystal       | 210    |
|                              |        | Neutral       | 114    |
|                              |        | Two-Tone      | 104    |

This query shows the break-down of the survey results for the quiz database for style, fit, shape and color

# 4.3 Purchase analysis

```
SELECT style, COUNT (style) AS 't_style'
FROM purchase
GROUP BY style;

SELECT model_name, COUNT(model_name) AS
't_name'
FROM purchase
GROUP BY model_name;
ORDER BY 2 DESC;

SELECT color, COUNT (color) AS 't_color'
FROM purchase
GROUP BY color;
ORDER BY 2 DESC;

SELECT price, COUNT (price) AS 't_price'
FROM purchase
GROUP BY price
ORDER BY 1 DESC;
```

This query shows purchase information for Warby Parker sales. It is broken-down by style, model\_name, price and color. Interesting that the lowest cost frame has the lowest sales.

| style          | t_style | color                  | t_color |
|----------------|---------|------------------------|---------|
| Men's Styles   | 243     | Jet Black              | 86      |
| Women's Styles | 252     | Driftwood Fade         | 63      |
| model_name     | t_name  |                        |         |
| Eugene Narrow  | 116     | Rosewood Tortoise      | 62      |
| Dawes          | 107     | Rose Crystal           | 54      |
| Brady          | 95      | Layered Tortoise Matte | 52      |
| Lucy           | 86      |                        |         |
| Olive          | 50      | Pearled Tortoise       | 50      |
| Monocle        | 41      | Elderflower Crystal    | 44      |
| price          | t_price |                        |         |
| 150            | 193     | Sea Glass Gray         | 43      |
| 95             | 261     | Endangered Tortoise    | 41      |
| 50             | 41      |                        |         |

# 5. Conclusion

# 5.1 Conclusions

```
SELECT model_name, price
FROM purchase
WHERE price = 50
GROUP BY model_name;
```

| model_name | price |
|------------|-------|
| Monocle    | 50    |

```
SELECT model_name, price
FROM purchase
GROUP BY model_name
GROUP BY price DESC;
```

| model_name    | price |
|---------------|-------|
| Dawes         | 150   |
| Lucy          | 150   |
| Brady         | 95    |
| Eugene Narrow | 95    |
| Olive         | 95    |
| Monocle       | 50    |

```
SELECT model_name, color,
COUNT (color) AS 'total'
FROM purchase
GROUP By color
ORDER BY model_name;
```

| model_name    | color                  |
|---------------|------------------------|
| Brady         | Layered Tortoise Matte |
| Brady         | Sea Glass Gray         |
| Dawes         | Driftwood Fade         |
| Eugene Narrow | Rose Crystal           |
| Eugene Narrow | Rosewood Tortoise      |
| Lucy          | Elderflower Crystal    |
| Lucy          | Jet Black              |
| Monocle       | Endangered Tortoise    |
| Olive         | Pearled Tortoise       |

A quick follow up query shows that cheapest frame is a monocle. We can then look at how much each model costs and compare it the the t\_style on slide 14 to see that the Eugene Narrow is the highest selling frame at the mid-price point.

A simple query shows the colors available for each model.

I'm stoked to start applying this knowledge to my work.

Thanks!