Marketing Attribution Analysis Case Study

Executive Summary

I built a first- vs last-click attribution pipeline in BigQuery and a Looker Studio dashboard to show how model choice changes perceived campaign and channel performance. Using a 7-day lookback (pre-purchase) and excluding unattributed orders, MTD revenue appears equal under both models (~\$94.3K each), but credit shifts across campaigns/channels. Paid Search dominates overall; Display/Paid Social gain more under last-click. AOV remains stable (~\$158), indicating attribution affects *allocation of credit*, not customer spend.

Phase 1 - Understand & Prepare the Data (EDA + Cleaning Plan)

Source files

- ad_events.csv user-level events
 Fields: user_id, event_type (click|purchase), event_ts, campaign_id, campaign_name,
 channel, order_id, order_value
- **ad_spend_daily.csv** daily media metrics Fields: date, campaign_id, campaign_name, channel, spend, impressions, clicks

What to clean (principles applied)

ad_events (raw → clicks & purchases):

- Keep only click and purchase
- Trim/standardize text fields (normalize channel casing)
- Remove purchases with NULL/non-positive order value or NULL order id
- De-duplicate purchases on order_id (keep most recent / highest value)
- De-duplicate exact duplicate clicks (user_id + event_ts + campaign_id + channel)
- Keep timestamps as TIMESTAMP; flag (not drop) extreme order value outliers

ad_spend_daily (raw → clean):

- Trim/standardize campaign and channel fields
- Replace NULL metrics with o; clamp negatives to o
- Roll up to one row per date × campaign_id × channel (sum spend/impressions/clicks)

Phase 2 - Data Preparation (BigQuery)

Datasets

- Raw: suvimarketingdataanalysis.marketing_data
- **Staging/Clean:** suvimarketingdataanalysis.marketing_data_stg

Staging tables created

- ad_events_purchases_clean valid, deduped purchases with standardized dimensions
- ad_events_clicks_clean valid, deduped clicks with standardized dimensions
- ad_spend_daily_clean rolled-up media metrics by date × campaign × channel

Attribution table

- revenue_by_model_campaign_daily Logic:
 - Join each purchase to eligible clicks within 7 days before the purchase timestamp;
 ignore post-purchase clicks
 - Exclude purchases with no eligible click (unattributed by design)
 - Assign revenue to:
 - First Click (earliest eligible click)
 - Last Click (latest eligible click)
 - Aggregate to date × campaign × channel × model with:
 - attributed_revenue
 - attributed orders

Rollups (dashboard-ready)

- attr_rollup_by_campaign totals by campaign × channel × model
- attr rollup by channel totals by channel × model

Phase 3 - Dashboard Implementation (Looker Studio)

Structure (3 pages)

- 1. **Landing Page** Objective & methodology
 - 7-day lookback (pre-purchase)
 - o Unattributed purchases excluded
 - o First vs Last click definitions

2. Revenue Trends & Campaign Performance

- o MTD Revenue (scorecards): First vs Last (~\$94.3K each)
- o Daily Attributed Revenue (Last 30 Days): two series by model
- Top Campaigns by Model: side-by-side bar charts

3. Channel Mix & Model Disagreement

- o Channel Mix: revenue share by channel for each model
- o Orders & AOV by Model: count and AOV (≈ \$158)
- Model Disagreement: table showing Revenue Delta (Last First) with conditional coloring (green = closer, red = introducer)

Key Findings (Marketing Interpretation)

• Model choice changes the story.

MTD totals are similar across models (as expected), but who gets credit shifts.

- Campaign roles diverge.
 - o Brand Search gains under first-click → strong entry/awareness driver.
 - Awareness Blast and parts of Paid Social gain under last-click → strong closers/remarketing.
- Channel mix is stable but reweighted.

Paid Search remains the largest contributor overall; Paid Social/Display pick up more credit under last-click.

• Customer spend is steady.

AOV \approx \$158 under both models \rightarrow attribution affects allocation, not basket size.

• Attribution coverage.

~47% of purchases attributed within the 7-day window; ~53% unattributed (organic/other/missing touchpoints). This is typical and should be communicated to stakeholders.

Business Implications

- **Budgeting:** Avoid over-relying on last-click; you risk under-funding awareness drivers (e.g., Brand Search) that fill the funnel.
- **Planning:** Treat Display/Paid Social as closers in retargeting flighting; keep Brand Search funded as a consistent entry lever.
- **Measurement:** Consider blended (e.g., 50/50) or multi-touch models for a balanced view; retain first vs last comparison in monthly reviews.

Quality Checks (performed)

- **Spec compliance:** 7-day pre-purchase lookback; post-purchase clicks ignored; unattributed purchases excluded.
- **Conservation:** Total attributed revenue and order counts match across models (only allocation differs).
- **Deduping:** No duplicate order_id in clean purchases; no exact-duplicate clicks after staging.
- **Media sanity:** No negative spend; clicks ≤ impressions; one row per date × campaign × channel.

Deliverables Summary

- BigQuery (SQL implementation):
 - Clean staging tables in marketing_data_stg
 - Attribution table revenue by model campaign daily (first vs last)
 - Rollups by campaign/channel for dashboarding

Looker Studio dashboard:

 MTD model comparison, 30-day trends, top campaigns (side-by-side), model disagreement (delta with conditional colors), channel mix, orders & AOV

• Insights:

• First- vs last-click materially reweights campaign/channel credit; AOV stable; clear guidance for budget allocation and flighting.