

Name:Himanshu Sharma
project_name:Customer segmentation analysis to improve conversion

----->
1. Summary of active vs closed accounts.

```
SELECT
    "ACCOUNT_STATUS",
    COUNT("ACCOUNT_STATUS") AS TOTAL_ACCOUNT_STATUS
FROM
    TRANSACTION_LINE TL
GROUP BY
    1
ORDER BY
    1;
```

-- 2. Breakdown of account types (e.g., loans, credit cards) and their current balances.

```
SELECT
    "ACCOUNT_CATEGORY",
    COUNT(*) as count,
    SUM("ACCOUNT_BALANCE") AS TOTAL_CURRENT_BALANCE
FROM
    TRANSACTION_LINE TL
GROUP BY
    1
ORDER BY
    1;
```

-- 3. Analysis of loan amounts vs. account balances.

```
SELECT
    "ACCOUNT_CATEGORY",
    AVG("SANCTIONED_AMOUNT") AS AVG_LOAN_AMOUNT,
    AVG("ACCOUNT_BALANCE") AS AVG_ACCOUNT_BALANCE
FROM
    TRANSACTION_LINE TL
GROUP BY
    1;
```

-- 4. overview of the closure percentages for different loan types by ownership type
(Individual vs Joint Account)

-- Joint Account

```
WITH TOTAL_LOANS AS (
SELECT
    "ACCOUNT_CATEGORY",
    COUNT("ACCOUNT_STATUS") AS TOTAL_LOAN
FROM
    TRANSACTION_LINE TL
WHERE
    "OWNERSHIP_TYPE" = 'Joint Account'
GROUP BY
    1
),
TOTAL_CLOSED_LOANS AS (
SELECT
    "ACCOUNT_CATEGORY",
    COUNT("ACCOUNT_STATUS") AS TOTAL_CLOSED_LOAN
FROM
    TRANSACTION_LINE TL
WHERE
    "OWNERSHIP_TYPE" = 'Joint Account'
    AND "ACCOUNT_STATUS" = 'Closed'
GROUP BY
    1
)
```

```

SELECT
    TL."ACCOUNT_CATEGORY",
    TL.TOTAL_LOAN,
    TCL.TOTAL_CLOSED_LOAN,
    ROUND((TCL.TOTAL_CLOSED_LOAN::DECIMAL * 100 / TL.TOTAL_LOAN),
    2) AS CLOSURE_PERCENTAGE
FROM
    TOTAL_LOANS TL
JOIN TOTAL_CLOSED_LOANS TCL ON
    TL."ACCOUNT_CATEGORY" = TCL."ACCOUNT_CATEGORY"
GROUP BY
    1,
    2,
    3;

```

```

-- Individual
WITH TOTAL_LOANS AS (
SELECT
    "ACCOUNT_CATEGORY",
    COUNT("ACCOUNT_STATUS") AS TOTAL_LOAN
FROM
    TRANSACTION_LINE TL
WHERE
    "OWNERSHIP_TYPE" = 'Individual'
GROUP BY
    1
),
TOTAL_CLOSED_LOANS AS (
SELECT
    "ACCOUNT_CATEGORY",
    COUNT("ACCOUNT_STATUS") AS TOTAL_CLOSED_LOAN
FROM
    TRANSACTION_LINE TL
WHERE
    "OWNERSHIP_TYPE" = 'Individual'
    AND "ACCOUNT_STATUS" = 'Closed'
GROUP BY
    1
)
SELECT
    TL."ACCOUNT_CATEGORY",
    TL.TOTAL_LOAN,
    TCL.TOTAL_CLOSED_LOAN,
    ROUND((TCL.TOTAL_CLOSED_LOAN::DECIMAL * 100 / TL.TOTAL_LOAN),
    2) AS CLOSURE_PERCENTAGE
FROM
    TOTAL_LOANS TL
JOIN TOTAL_CLOSED_LOANS TCL ON
    TL."ACCOUNT_CATEGORY" = TCL."ACCOUNT_CATEGORY"
GROUP BY
    1,
    2,
    3;

```

-- 5. Let's start by segmenting customers based on FICO scores and account categories to see the distribution.

```

WITH FICO_SCORE_RANGES AS (
SELECT
    "CUSTOMER_ID",
    "FICO_SCORE",
    "ACCOUNT_CATEGORY",
    CASE
        WHEN "FICO_SCORE" BETWEEN 300 AND 549 THEN 'VERY POOR'
        WHEN "FICO_SCORE" BETWEEN 550 AND 649 THEN 'POOR'

```

```

        WHEN "FICO_SCORE" BETWEEN 650 AND 749 THEN 'FAIR'
        WHEN "FICO_SCORE" BETWEEN 750 AND 849 THEN 'GOOD'
        WHEN "FICO_SCORE" BETWEEN 850 AND 949 THEN 'EXCELLENT'
    END AS CREDIT_SEGMENT
FROM
    TRANSACTION_LINE TL
) ,
TOTAL_CUSTOMERS AS (
SELECT
    COUNT(DISTINCT "CUSTOMER_ID") AS TOTAL_CUSTOMER
FROM
    TRANSACTION_LINE TL
)
SELECT
    CREDIT_SEGMENT,
    "ACCOUNT_CATEGORY",
    COUNT("CUSTOMER_ID") AS CUSTOMER_SEGMENT_COUNT,
    TC.TOTAL_CUSTOMER,
    (COUNT("CUSTOMER_ID") * 100 / TC.TOTAL_CUSTOMER) AS PERCENTAGE
FROM
    FICO_SCORE_RANGES FSR
CROSS JOIN TOTAL_CUSTOMERS TC
GROUP BY
    1,
    2,
    4
ORDER BY
    2;

```

-- 6. Product Usage Segmentation: Categorizing customers by the types of accounts they hold (e.g., Auto Loans, Credit Cards, etc.).

```

WITH PRODUCT_SEGMENTATION AS (
SELECT
    "CUSTOMER_ID",
    CASE
        WHEN AUTO_LOAN = 1 THEN
            CASE
                WHEN CONSUMER_LOAN + CREDIT_CARD + GOLD_LOAN + HOUSING_LOAN +
PERSONAL_LOAN + TWO_WHEELER_LOAN = 0 THEN 'AUTO LOAN ONLY'
                ELSE 'AUTO LOAN, ' ||
                    CASE
                        WHEN CONSUMER_LOAN = 1 THEN 'CONSUMER LOAN, '
                        ELSE ''
                    END ||
                    CASE
                        WHEN CREDIT_CARD = 1 THEN 'CREDIT CARD, '
                        ELSE ''
                    END ||
                    CASE
                        WHEN GOLD_LOAN = 1 THEN 'GOLD LOAN, '
                        ELSE ''
                    END ||
                    CASE
                        WHEN HOUSING_LOAN = 1 THEN 'HOUSING LOAN, '
                        ELSE ''
                    END ||
                    CASE
                        WHEN PERSONAL_LOAN = 1 THEN 'PERSONAL LOAN, '
                        ELSE ''
                    END ||
                    CASE
                        WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN'
                        ELSE ''
                    END
            END
    END
)

```

```

END
WHEN CONSUMER_LOAN = 1 THEN
CASE
    WHEN CREDIT_CARD + GOLD_LOAN + HOUSING_LOAN + PERSONAL_LOAN +
TWO_WHEELER_LOAN = 0 THEN 'CONSUMER LOAN ONLY'
    ELSE 'CONSUMER LOAN, ' ||
        CASE
            WHEN CREDIT_CARD = 1 THEN 'CREDIT CARD, '
            ELSE ''
        END ||
        CASE
            WHEN GOLD_LOAN = 1 THEN 'GOLD LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN HOUSING_LOAN = 1 THEN 'HOUSING LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN PERSONAL_LOAN = 1 THEN 'PERSONAL LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN'
            ELSE ''
        END
    END
END
WHEN CREDIT_CARD = 1 THEN
CASE
    WHEN GOLD_LOAN + HOUSING_LOAN + PERSONAL_LOAN + TWO_WHEELER_LOAN = 0
THEN 'CREDIT CARD ONLY'
    ELSE 'CREDIT CARD, ' ||
        CASE
            WHEN GOLD_LOAN = 1 THEN 'GOLD LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN HOUSING_LOAN = 1 THEN 'HOUSING LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN PERSONAL_LOAN = 1 THEN 'PERSONAL LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN'
            ELSE ''
        END
    END
END
WHEN GOLD_LOAN = 1 THEN
CASE
    WHEN HOUSING_LOAN + PERSONAL_LOAN + TWO_WHEELER_LOAN = 0 THEN 'GOLD LOAN
ONLY'
    ELSE 'GOLD LOAN, ' ||
        CASE
            WHEN HOUSING_LOAN = 1 THEN 'HOUSING LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN PERSONAL_LOAN = 1 THEN 'PERSONAL LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN'
            ELSE ''
        END
    END
END

```

```

END
WHEN HOUSING_LOAN = 1 THEN
CASE
    WHEN PERSONAL_LOAN + TWO_WHEELER_LOAN = 0 THEN 'HOUSING LOAN ONLY'
    ELSE 'HOUSING LOAN, ' ||
        CASE
            WHEN PERSONAL_LOAN = 1 THEN 'PERSONAL LOAN, '
            ELSE ''
        END ||
        CASE
            WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN'
            ELSE ''
        END
    END
END
WHEN PERSONAL_LOAN = 1 THEN
CASE
    WHEN TWO_WHEELER_LOAN = 0 THEN 'PERSONAL LOAN ONLY'
    ELSE 'PERSONAL LOAN, TWO WHEELER LOAN'
END
WHEN TWO_WHEELER_LOAN = 1 THEN 'TWO WHEELER LOAN ONLY'
ELSE 'NO LOANS'
END AS CUSTOMER_SEGMENT
FROM
(
    SELECT
        "CUSTOMER_ID",
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Auto Loan' THEN 1 ELSE 0 END) AS
AUTO_LOAN,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Consumer Loan' THEN 1 ELSE 0 END) AS
CONSUMER_LOAN,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Credit Card' THEN 1 ELSE 0 END) AS
CREDIT_CARD,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Gold Loan' THEN 1 ELSE 0 END) AS
GOLD_LOAN,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Housing Loan' THEN 1 ELSE 0 END) AS
HOUSING_LOAN,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Personal Loan' THEN 1 ELSE 0 END) AS
PERSONAL_LOAN,
        MAX(CASE WHEN "ACCOUNT_CATEGORY" = 'Two-Wheeler Loan' THEN 1 ELSE 0 END) AS
TWO_WHEELER_LOAN
    FROM
        TRANSACTION_LINE TL
    GROUP BY
        1
) AS CUSTOMER_ACCOUNTS
)
SELECT
    CUSTOMER_SEGMENT,
    COUNT("CUSTOMER_ID") AS TOTAL_CUSTOMER
FROM
    PRODUCT_SEGMENTATION PS
GROUP BY
    1
ORDER BY
    1;

```

-- 7. Account Activity Segmentation: Segmenting customers by the status of their accounts (whether they have more active or closed accounts).

```

SELECT
    "CUSTOMER_ID",
    COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) AS ACTIVE_ACCOUNTS,
    COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Closed' THEN 1 END) AS CLOSED_ACCOUNTS,
    CASE

```

```

        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Closed' THEN 1 END) = 0 THEN 'FULLY
ACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) > COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'MOSTLY ACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) = COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'BALANCED'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) < COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'MOSTLY INACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) = 0 THEN 'FULLY
INACTIVE'
    END AS ACTIVITY_SEGMENT
FROM
    TRANSACTION_LINE TL
GROUP BY
    1;

```

-- 8. Account Activity Segmentation Count

```

WITH ACTIVITY_SEGMENTS AS (
SELECT
    "CUSTOMER_ID",
    COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) AS ACTIVE_ACCOUNTS,
    COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Closed' THEN 1 END) AS CLOSED_ACCOUNTS,
    CASE
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Closed' THEN 1 END) = 0 THEN 'FULLY
ACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) > COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'MOSTLY ACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) = COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'BALANCED'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) < COUNT(CASE WHEN
"ACCOUNT_STATUS" = 'Closed' THEN 1 END) THEN 'MOSTLY INACTIVE'
        WHEN COUNT(CASE WHEN "ACCOUNT_STATUS" = 'Active' THEN 1 END) = 0 THEN 'FULLY
INACTIVE'
    END AS ACTIVITY_SEGMENT
FROM
    TRANSACTION_LINE TL
GROUP BY
    1
)
SELECT
    ACTIVITY_SEGMENT,
    COUNT("CUSTOMER_ID") AS TOTAL_CUSTOMER
FROM
    ACTIVITY_SEGMENTS
GROUP BY
    1
ORDER BY
    1;

```

-- 9. Create a cohort to reveal insights into customer retention and the life cycle of accounts.

-- for example: categorize customers into cohorts based on their account opening dates and then analyse how these cohorts have behaved over time

-- analyse retention Rates (how long accounts stay open across different cohorts)

```
SET datestyle = 'DMY';
```

```

WITH cohorts AS (
    SELECT
        "CUSTOMER_ID",
        DATE_TRUNC('MONTH',
            CASE
                WHEN "OPENING_DATE" = '' THEN NULL
                ELSE TO_DATE("OPENING_DATE", 'DD-MM-YYYY')
            END

```

```

)::DATE AS cohort_month,
"ACCOUNT_CATEGORY",
COALESCE(
    CASE
        WHEN "CLOSED_DATE" = '' THEN NULL
        ELSE TO_DATE("CLOSED_DATE", 'DD-MM-YYYY')
    END,
    NOW()
)::DATE AS end_date
FROM
    transaction_line tl
WHERE
    "OPENING_DATE" != ''
),
cohort_sizes AS (
    SELECT
        cohort_month,
        "ACCOUNT_CATEGORY",
        COUNT(DISTINCT "CUSTOMER_ID") AS total_customers
    FROM
        cohorts c
    GROUP BY
        1,
        2
),
retention AS (
    SELECT
        c.cohort_month,
        c."ACCOUNT_CATEGORY",
        cs.total_customers,
        COUNT(DISTINCT
            CASE
                WHEN DATE_TRUNC('MONTH', c.end_date) >= c.cohort_month + INTERVAL '12
MONTHS' THEN c."CUSTOMER_ID"
            END
        ) AS retained_customers_after_12_months
    FROM
        cohorts c
    JOIN cohort_sizes cs ON
        c.cohort_month = cs.cohort_month
        AND c."ACCOUNT_CATEGORY" = cs."ACCOUNT_CATEGORY"
    GROUP BY
        1,
        2,
        3
)
SELECT
    cohort_month,
    "ACCOUNT_CATEGORY",
    total_customers,
    retained_customers_after_12_months,
    ROUND((retained_customers_after_12_months::DECIMAL / total_customers::DECIMAL) * 100,
    2) AS retention_rate_after_12_months
FROM
    retention r
WHERE
    cohort_month <= NOW() - INTERVAL '12 MONTHS'
ORDER BY
    1,
    2;

```

-- 10. Identify Common Account Combinations: Look at customers who have multiple account types and identify common combinations.

-- Predict Likely Next Products: Based on product holding patterns and customer behaviour within cohorts.

-- This step aggregates data for each customer:

- 1. Creates an array of unique account types they have
- 2. Counts the number of different account types
- 3. Calculates average FICO score, total balance, and maximum tenure

```
WITH customer_accounts AS (  
    SELECT  
        "CUSTOMER_ID",  
        ARRAY_AGG(DISTINCT "ACCOUNT_CATEGORY" ORDER BY "ACCOUNT_CATEGORY") AS  
account_types,  
        COUNT(DISTINCT "ACCOUNT_CATEGORY") AS num_account_types,  
        ROUND(AVG("FICO_SCORE"),2) AS avg_fico_score,  
        SUM("ACCOUNT_BALANCE") AS total_balance,  
        MAX("TENURE_MONTHS") AS max_tenure  
    FROM transaction_line  
    GROUP BY 1  
)
```

-- This identifies the most common combinations of account types:

- 1. Groups by the array of account types
- 2. Counts how many customers have each combination

```
account_combinations AS (  
    SELECT  
        account_types,  
        COUNT(*) AS combination_count  
    FROM customer_accounts  
    GROUP BY account_types  
    ORDER BY COUNT(*) DESC  
)
```

-- This step:

- 1. Takes the customer account information
- 2. Adds a new column 'potential_products' which is an array of account types the customer doesn't currently have

```
customer_potential AS (  
    SELECT  
        ca."CUSTOMER_ID",  
        ca.account_types,  
        ca.num_account_types,  
        ca.avg_fico_score,  
        ca.total_balance,  
        ca.max_tenure,  
        (SELECT ARRAY_AGG(DISTINCT ac."ACCOUNT_CATEGORY")  
         FROM transaction_line ac  
         WHERE ac."ACCOUNT_CATEGORY" != ALL(ca.account_types)) AS potential_products  
    FROM customer_accounts ca  
)
```

-- This final step:

- 1. Selects relevant information for each customer
- 2. Adds a 'recommended_product' based on simple rules:
 - 2.1. Credit Card for high FICO score customers without one
 - 2.2. Investment Account for high balance customers without one
 - 2.3. Loan Product for long-term customers without one
- 3. Orders results by total balance and FICO score to prioritize high-value customers

```
SELECT  
    cp."CUSTOMER_ID",  
    cp.account_types AS current_products,  
    cp.num_account_types,  
    cp.avg_fico_score,  
    cp.total_balance,  
    cp.max_tenure,  
    cp.potential_products as recommended_product  
FROM customer_potential cp  
ORDER BY cp.total_balance DESC, cp.avg_fico_score desc;
```



```
-- Summary of this query:
-- 1. Identify Common Account Combinations: The account_combinations CTE shows the most
common product combinations.
-- 2. Predict Likely Next Products: The potential_products column shows products the
customer doesn't have, and
-- the recommended_product column provides a simple recommendation based on their
profile.
```