1. Imports and Setup

```
import pandas as pd
import numpy as np
import os
from datetime import datetime

# --- Setup ---
# Create directories for processed data and figures if they don't exist
os.makedirs('../data/processed', exist_ok=True)
os.makedirs('../reports/figures', exist_ok=True)
print("Setup Complete. Directories are ready.")
```

Setup Complete. Directories are ready.

2. Load the Data

Data loaded successfully from: ../data/raw/data.xlsx Dataset shape: (233154, 41)

Out[13]:		UniqueID	disbursed_amount	asset_cost	ltv	branch_id	supplier_id	manufacturer
	0	420825	50578	58400	89.55	67	22807	
	1	417566	53278	61360	89.63	67	22807	
	2	539055	52378	60300	88.39	67	22807	
	3	529269	46349	61500	76.42	67	22807	
	4	563215	43594	78256	57.50	67	22744	

5 rows × 41 columns



3. Initial Inspection

```
In [14]: print("--- Data Info ---")
# .info() gives us column names, non-null counts, and data types.
df.info()

print("\n--- Missing Values (Top 15) ---")
# .isnull().sum() counts missing values for each column.
print(df.isnull().sum().sort_values(ascending=False).head(15))

print(f"\n--- Number of Duplicate Rows ---")
# .duplicated().sum() counts the number of identical rows.
print(df.duplicated().sum())
```

--- Data Info ---

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 233154 entries, 0 to 233153
Data columns (total 41 columns):
# Column
                                        Non-Null Count
                                                         Dtype
--- -----
                                         _____
                                                         ----
    UniqueID
                                         233154 non-null int64
a
    disbursed amount
                                        233154 non-null int64
1
                                        233154 non-null int64
    asset_cost
2
                                        233154 non-null float64
    branch_id
                                        233154 non-null int64
4
5
    supplier id
                                        233154 non-null int64
                                        233154 non-null int64
    manufacturer id
6
                                        233154 non-null int64
    Current_pincode_ID
    Date.of.Birth
                                        233154 non-null datetime64[ns]
    Employment.Type
                                        225493 non-null object
                                        233154 non-null datetime64[ns]
10 DisbursalDate
11 State ID
                                        233154 non-null int64
12 Employee code ID
                                        233154 non-null int64
                                        233154 non-null int64
13 MobileNo_Avl_Flag
                                        233154 non-null int64
14 Aadhar_flag
15 PAN_flag
                                        233154 non-null int64
16 VoterID_flag
                                        233154 non-null int64
                                        233154 non-null int64
17 Driving_flag
                                        233154 non-null int64
18 Passport flag
19 PERFORM CNS.SCORE
                                        233154 non-null int64
20 PERFORM CNS.SCORE.DESCRIPTION
                                        233154 non-null object
                                        233154 non-null int64
21 PRI.NO.OF.ACCTS
 22 PRI.ACTIVE.ACCTS
                                        233154 non-null int64
23 PRI.OVERDUE.ACCTS
                                        233154 non-null int64
24 PRI.CURRENT.BALANCE
                                        233154 non-null int64
                                        233154 non-null int64
 25 PRI.SANCTIONED.AMOUNT
 26 PRI.DISBURSED.AMOUNT
                                        233154 non-null int64
27 SEC.NO.OF.ACCTS
                                        233154 non-null int64
28 SEC.ACTIVE.ACCTS
                                        233154 non-null int64
 29 SEC.OVERDUE.ACCTS
                                        233154 non-null int64
 30 SEC.CURRENT.BALANCE
                                        233154 non-null int64
31 SEC.SANCTIONED.AMOUNT
                                        233154 non-null int64
                                        233154 non-null int64
 32 SEC.DISBURSED.AMOUNT
 33 PRIMARY.INSTAL.AMT
                                        233154 non-null int64
 34 SEC.INSTAL.AMT
                                        233154 non-null int64
                                        233154 non-null int64
 35 NEW.ACCTS.IN.LAST.SIX.MONTHS
 36 DELINQUENT.ACCTS.IN.LAST.SIX.MONTHS 233154 non-null int64
 37 AVERAGE.ACCT.AGE
                                        233154 non-null object
                                        233154 non-null object
 38 CREDIT.HISTORY.LENGTH
39 NO.OF INQUIRIES
                                        233154 non-null int64
40 loan default
                                         233154 non-null int64
dtypes: datetime64[ns](2), float64(1), int64(34), object(4)
memory usage: 72.9+ MB
--- Missing Values (Top 15) ---
Employment.Type
                     7661
disbursed amount
                        0
asset cost
                        0
ltv
                        0
branch id
supplier id
manufacturer_id
                        0
Current_pincode_ID
                        0
```

UniqueID

```
Date.of.Birth 0
DisbursalDate 0
State_ID 0
Employee_code_ID 0
MobileNo_Avl_Flag 0
Aadhar_flag 0
dtype: int64
--- Number of Duplicate Rows ---
```

4. Clean Column Names

```
In [15]: original_columns = df.columns
    df.columns = [col.strip().lower().replace('.', '_') for col in original_columns]
    print("Column names have been cleaned.")
    print("Example: '{}' is now '{}'".format(original_columns[10], df.columns[10]))

Column names have been cleaned.
Example: 'DisbursalDate' is now 'disbursaldate'
```

5. Handle Duplicates and Missing Values

```
In [19]: # --- Handle Duplicates ---
         if df.duplicated().sum() > 0:
             df.drop_duplicates(inplace=True)
             print(f"Dropped {df.duplicated().sum()} duplicate rows. New shape: {df.shape
         else.
             print("No duplicate rows found.")
         # --- Handle Missing Values ---
         # For 'employment_type', the number of missing values is small. We can fill with
         if 'employment_type' in df.columns:
             mode_employment = df['employment_type'].mode()[0]
             df['employment_type'] = df['employment_type'].fillna(mode_employment)
             print(f"Filled missing 'employment_type' values with '{mode_employment}'.")
         # Let's re-check missing values to confirm
         print("\nMissing values after handling:")
         print(df.isnull().sum().sort_values(ascending=False).head())
        No duplicate rows found.
        Filled missing 'employment_type' values with 'Self employed'.
        Missing values after handling:
        uniqueid
                            0
        disbursed_amount
        asset_cost
        ltv
        branch id
        dtype: int64
```

6. Feature Engineering - Create 'age' Column

```
In [20]: # --- Feature Engineering: Age ---
# Convert 'date_of_birth' to datetime objects. The format is Day-Month-2-digit-Y
df['date_of_birth'] = pd.to_datetime(df['date_of_birth'], format='%d-%m-%y')
```

```
# --- IMPORTANT: Correcting for the 'YY' to 'YYYY' ambiguity ---
# Pandas interprets years like '90' as 1990, but '10' as 2010.
# A person born in 2010 would be a child, which is unlikely for a loan applicant
# We assume anyone with a year > current_year was born in the 1900s.
current_year = datetime.now().year
df['birth_year'] = df['date_of_birth'].dt.year
df.loc[df['birth_year'] > current_year, 'birth_year'] -= 100

# Calculate age
df['age'] = current_year - df['birth_year']

# Drop the temporary 'birth_year' column
df.drop(columns=['birth_year'], inplace=True)

print("Created 'age' column from 'date_of_birth'.")
df[['date_of_birth', 'age']].head()
```

Created 'age' column from 'date_of_birth'.

Out[20]: date_of_birth age

0	1984-01-01	41
1	1985-08-24	40
2	1977-12-09	48
3	1988-06-01	37
4	1994-07-14	31

7. Save the Cleaned Data

```
In [21]: # --- Save Cleaned Data ---
    cleaned_file_path = '../data/processed/cleaned_loan_data.csv'
    df.to_csv(cleaned_file_path, index=False)

print(f"Cleaned data successfully saved to: {cleaned_file_path}")
```

Cleaned data successfully saved to: ../data/processed/cleaned_loan_data.csv